

# Cosmic Flows

as a Probe of the

## Large Scale Structure

of the

# Universe

Coffee Break

- The Expanding Universe
- Peculiar Velocities
- The Cosmic Distance Ladder

Bulk Flows

- Pairwise velocities
- Optimal moments
- Concluding remarks

**Hume A. Feldman**  
**University of Kansas**

2004 Santa Fe

Cosmology Summer Workshop

July 16, 2004



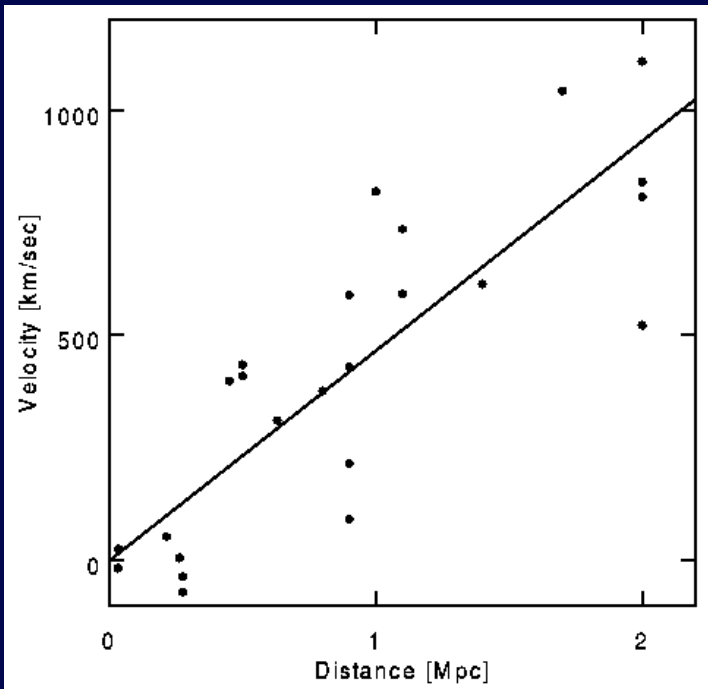
# The Expanding Universe

**1922 – Friedmann Showed that Einstein's Equations have an expanding solution.**

**1929 – Hubble observed that**  
**Distance  $\propto$  Redshift**

**In a HOMOGENEOUS Universe:  $H_0 r = cz = c \delta\lambda / \lambda$**

$$H_0 = 500 \text{ km / s / Mpc}$$



**Hubble Original data**



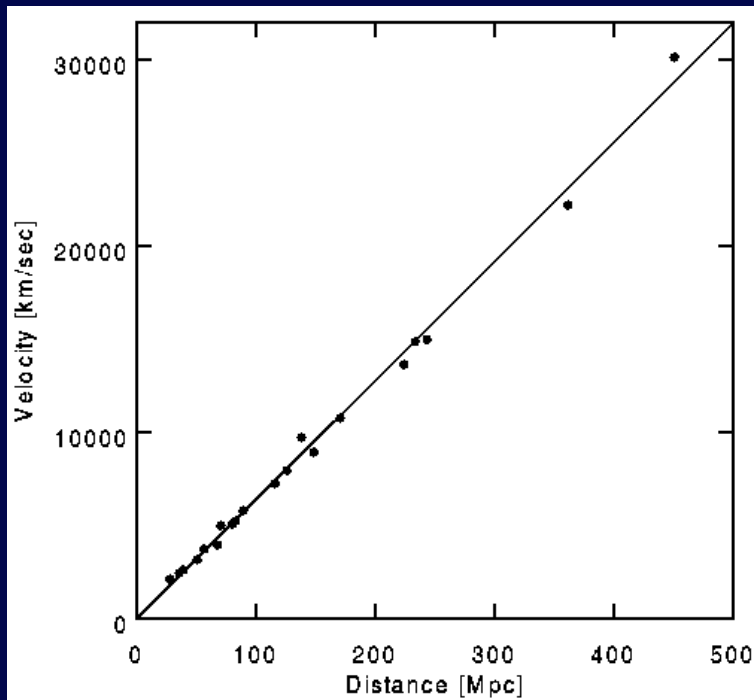
# The Expanding Universe

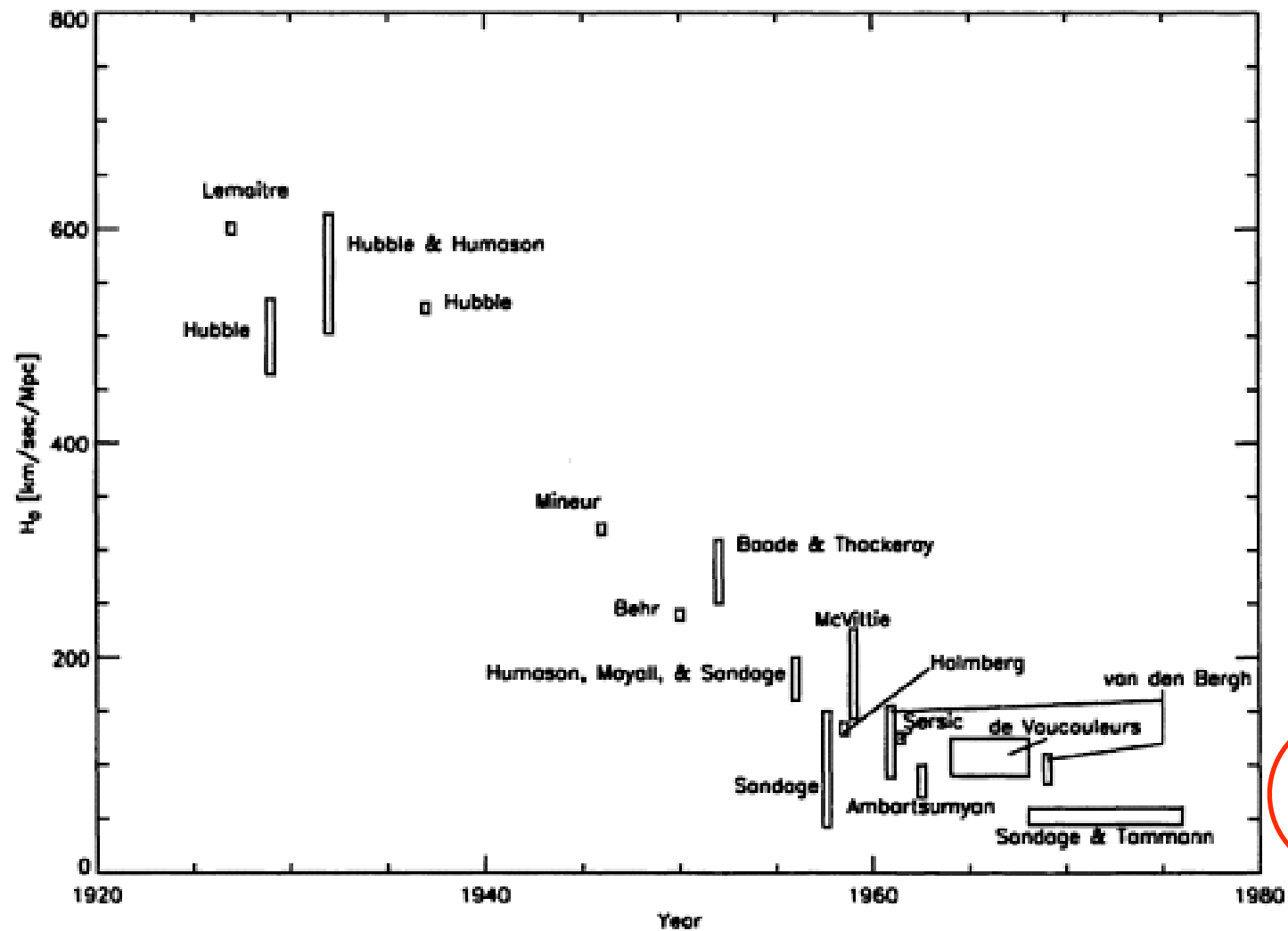
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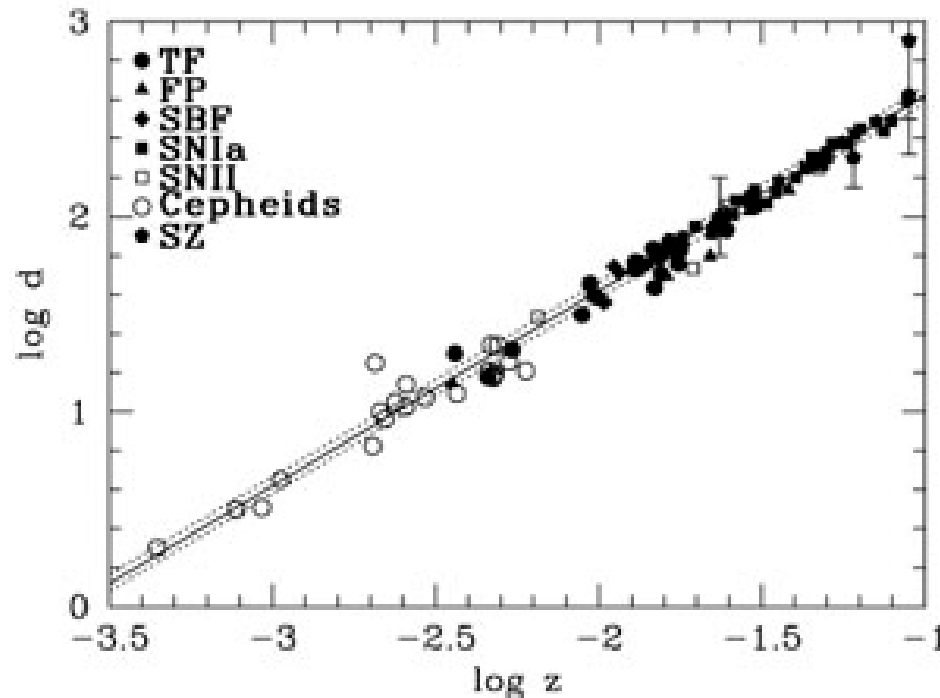
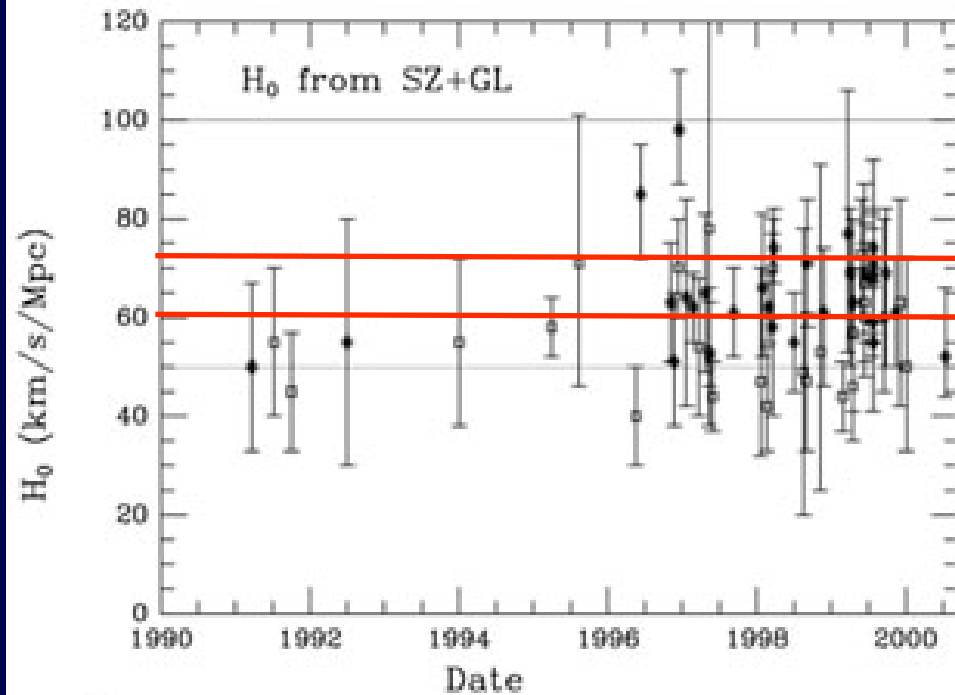
**In a HOMOGENEOUS Universe:**  $H_0 r = cz = c \delta\lambda / \lambda$

$$H_0 = 65 \pm 15 \text{ km / s / Mpc}$$





# The Hubble Constant

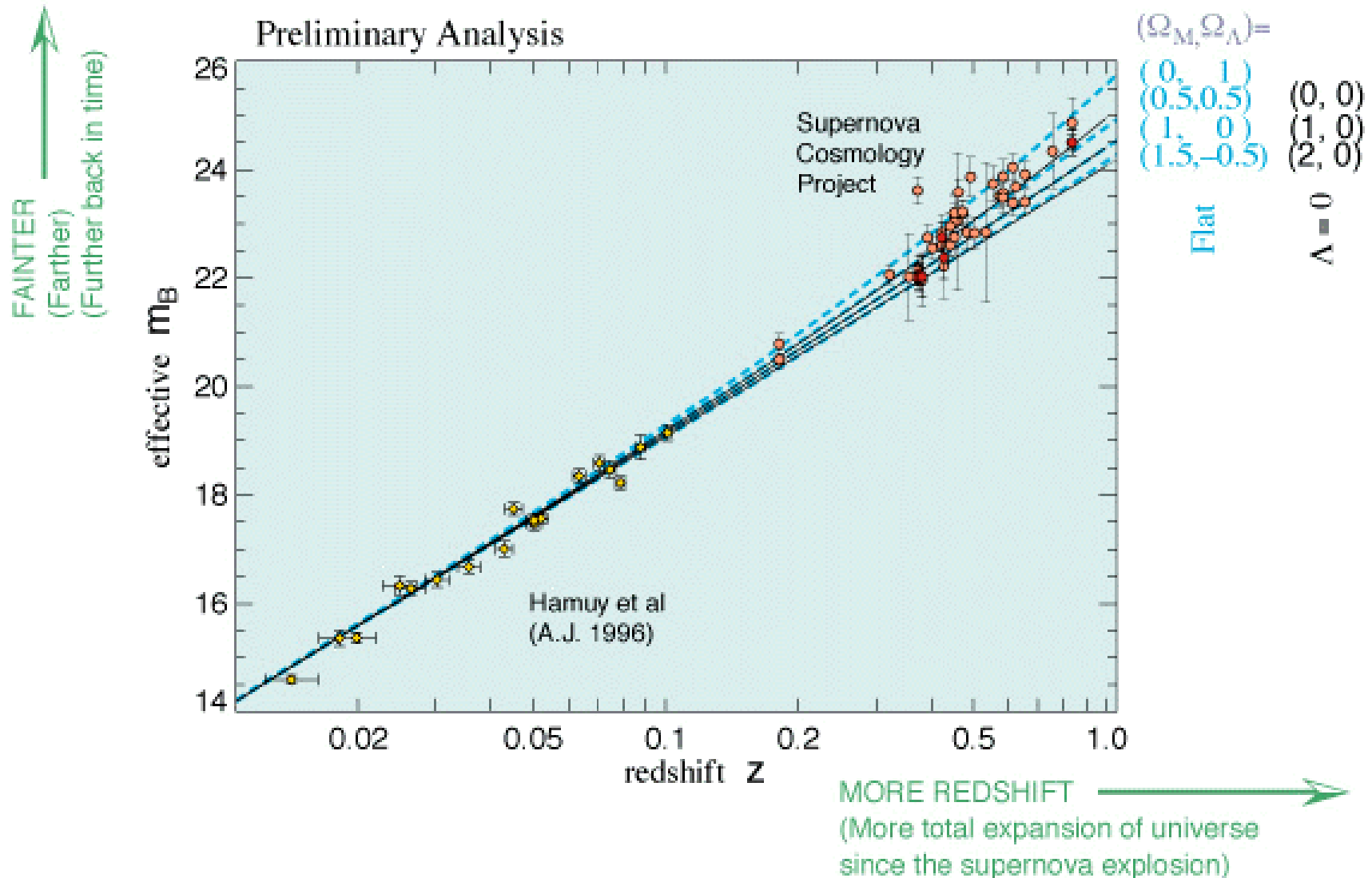


The solid line is for  $H_0 = 72$   $\text{km/s/Mpc}$  with the dashed lines representing  $\pm 10\%$

Freedman et al, 2003

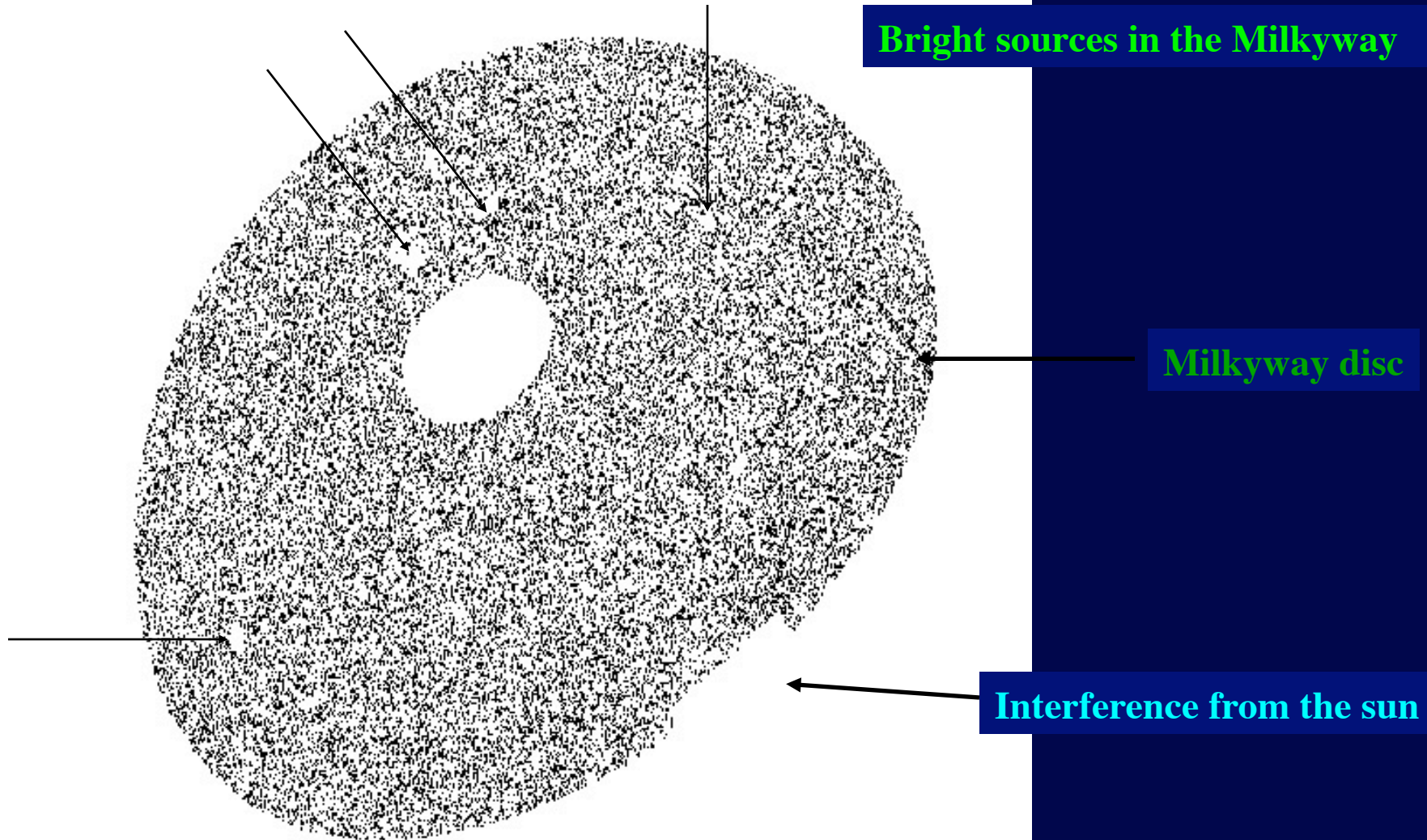


# Hubble Plots

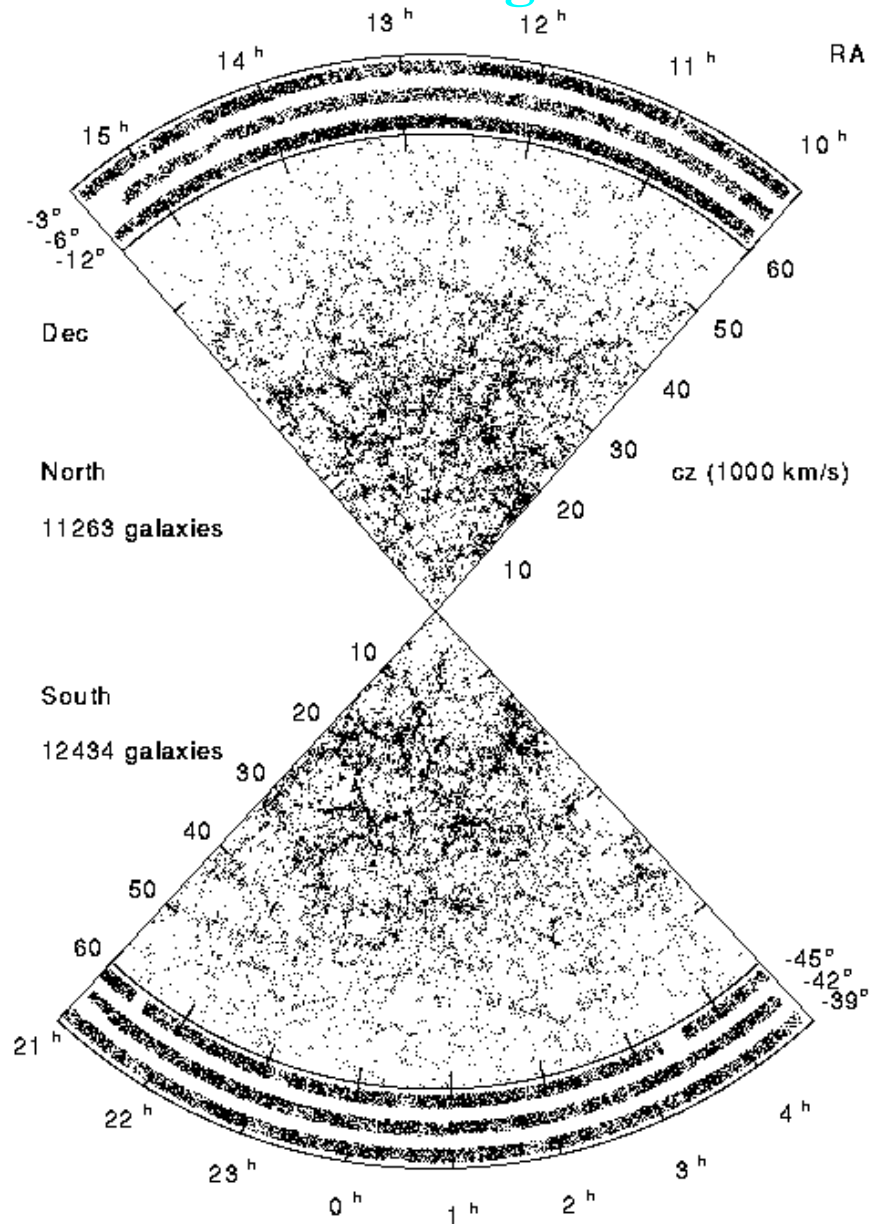


# Is the Universe Homogeneous ?

Angular Distribution of the ~34,000 brightest 6cm radio sources  
(Gregory & Condon, 1991)



# Is the Universe Homogeneous ?

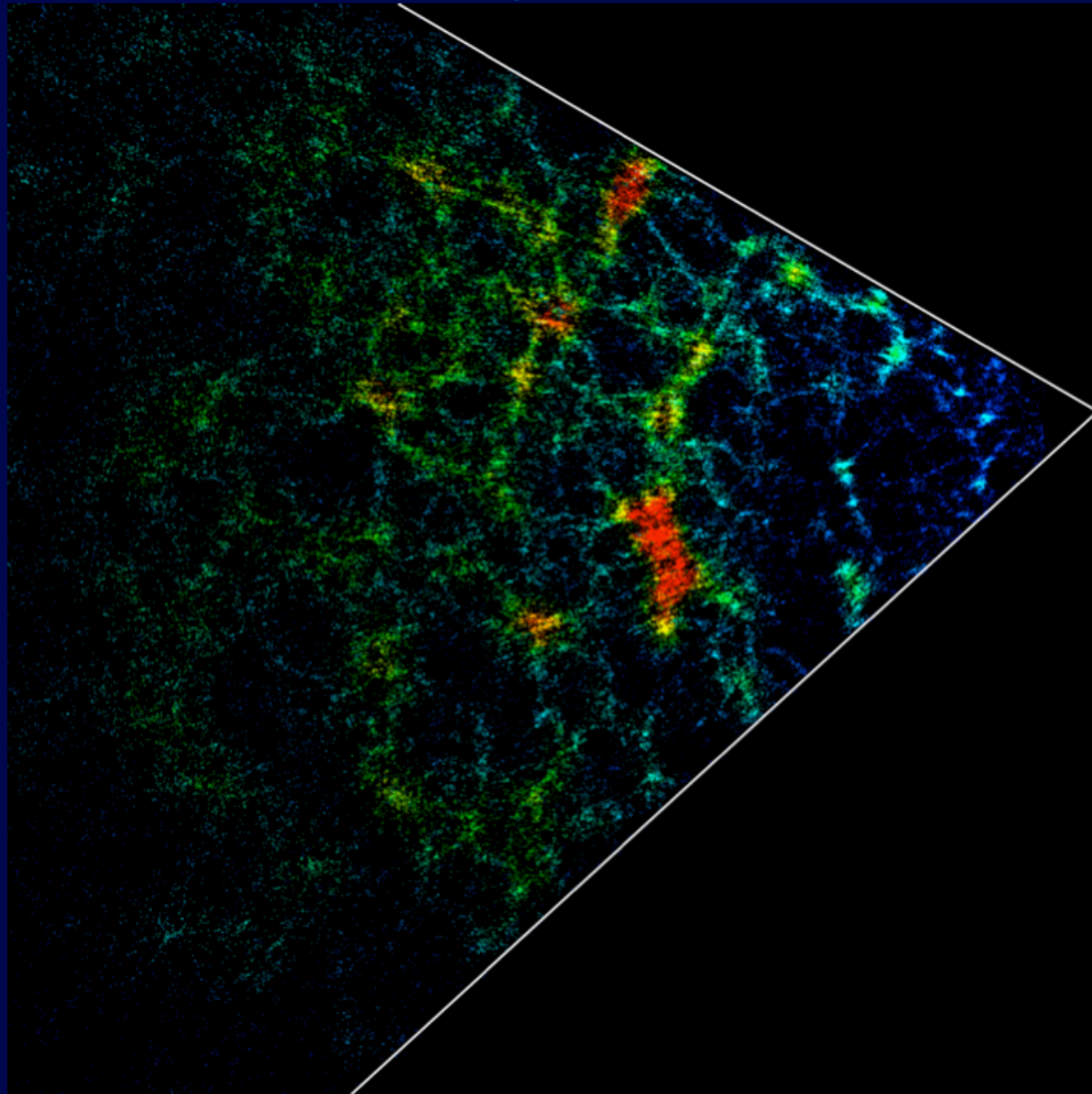


LCRS, Sheckman et al, 1996



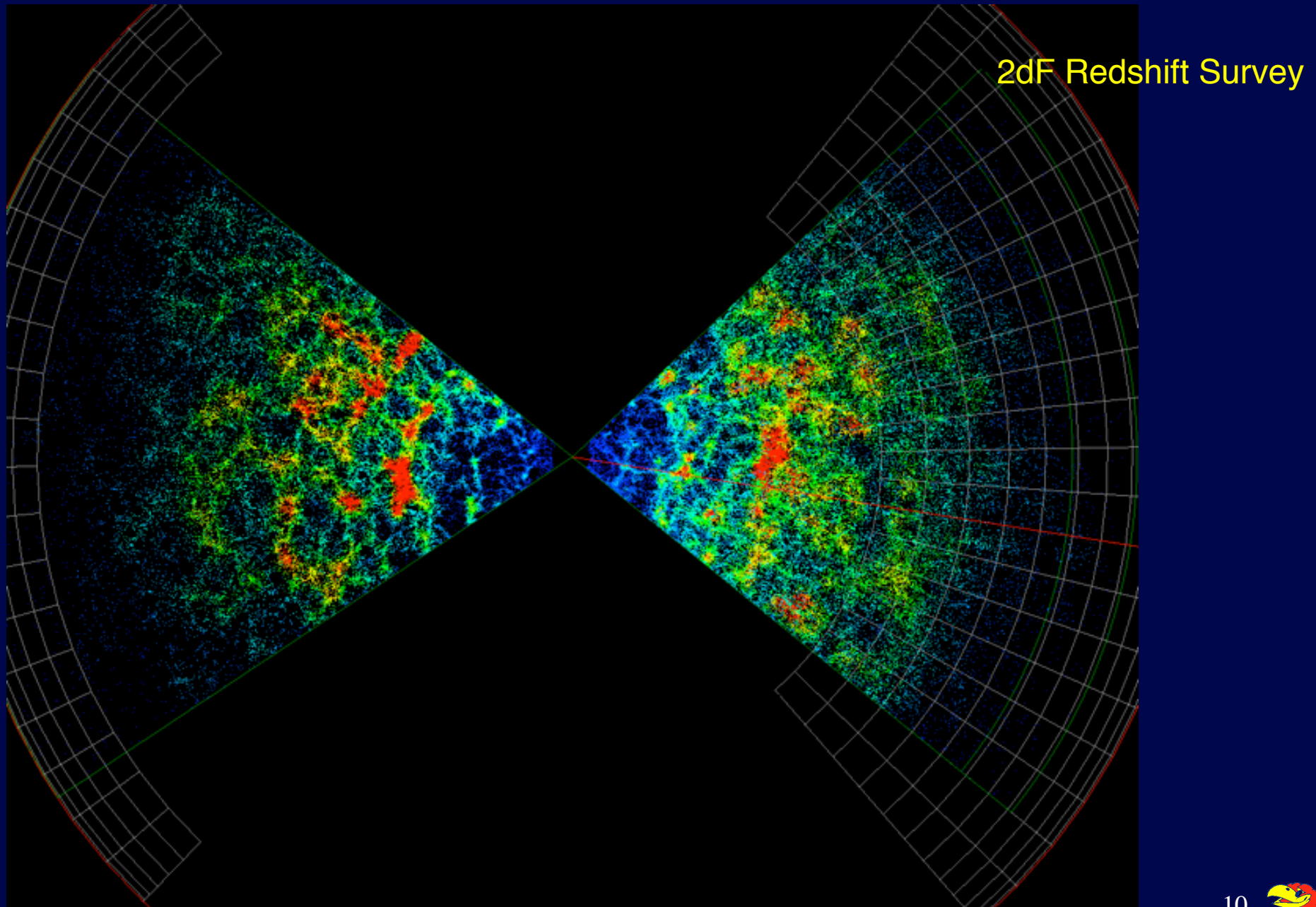


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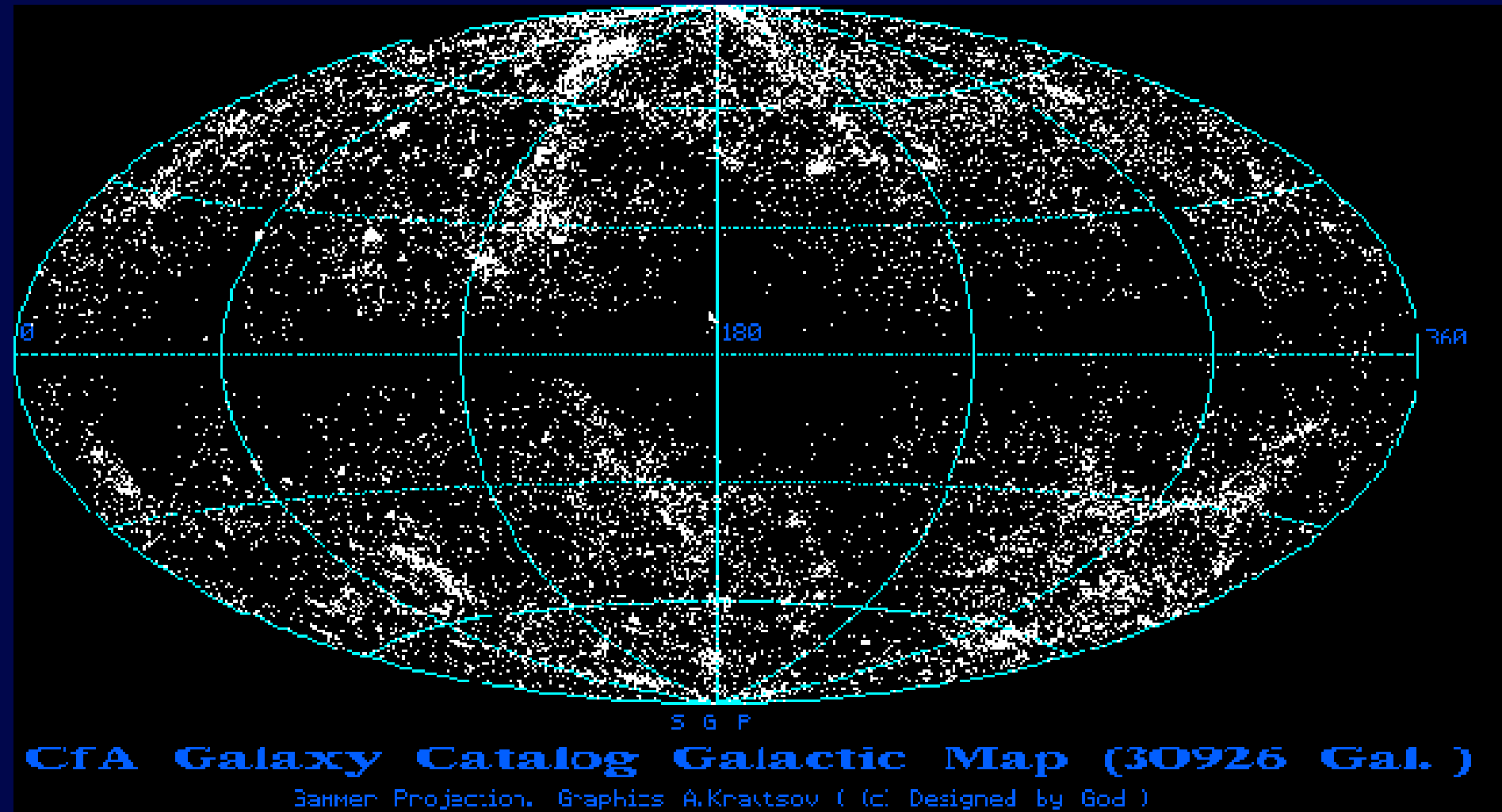


2dF Redshift Survey

# Is the Universe Homogeneous ?

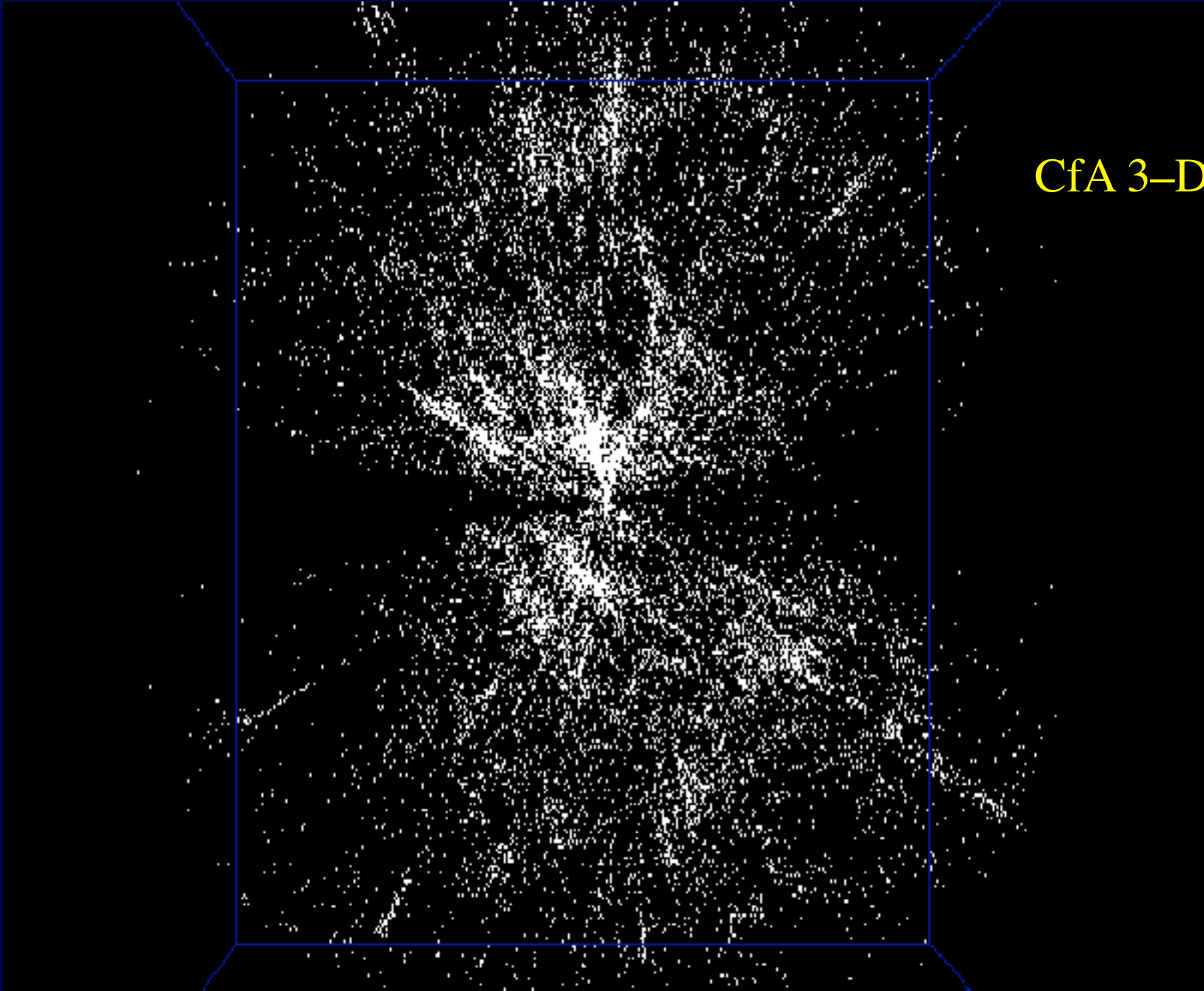


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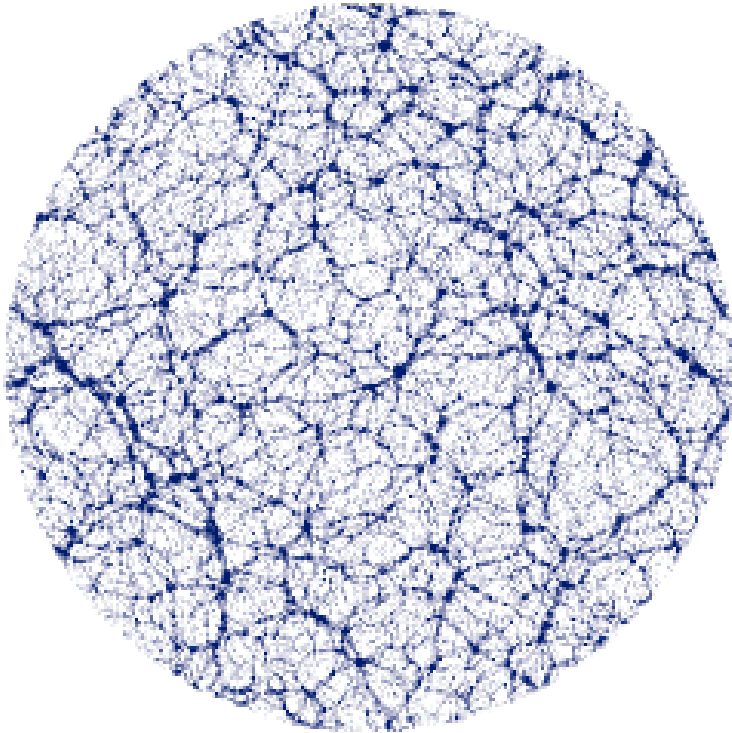
# Is the Universe Homogeneous ?

CfA 3-D

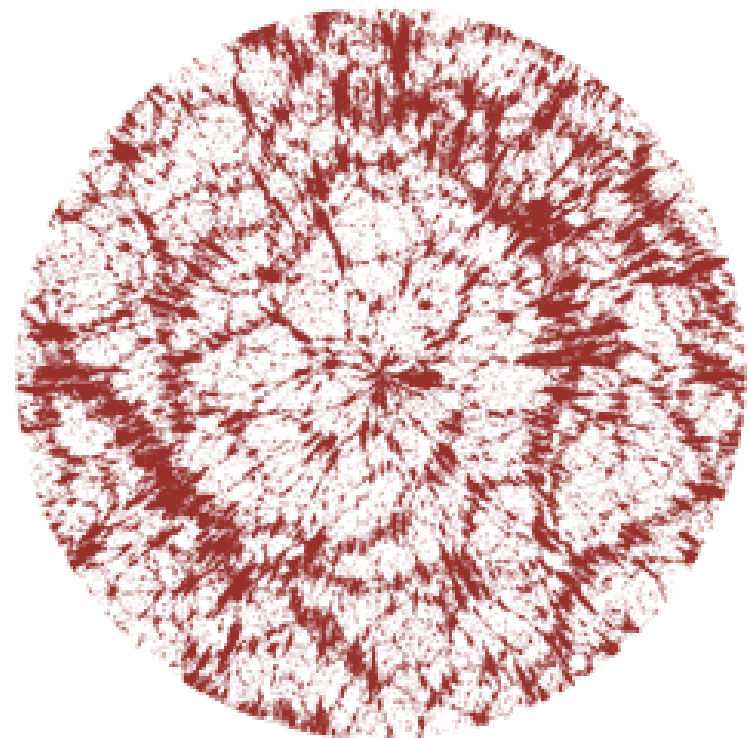


# Redshift Distortions

Real Space Distribution

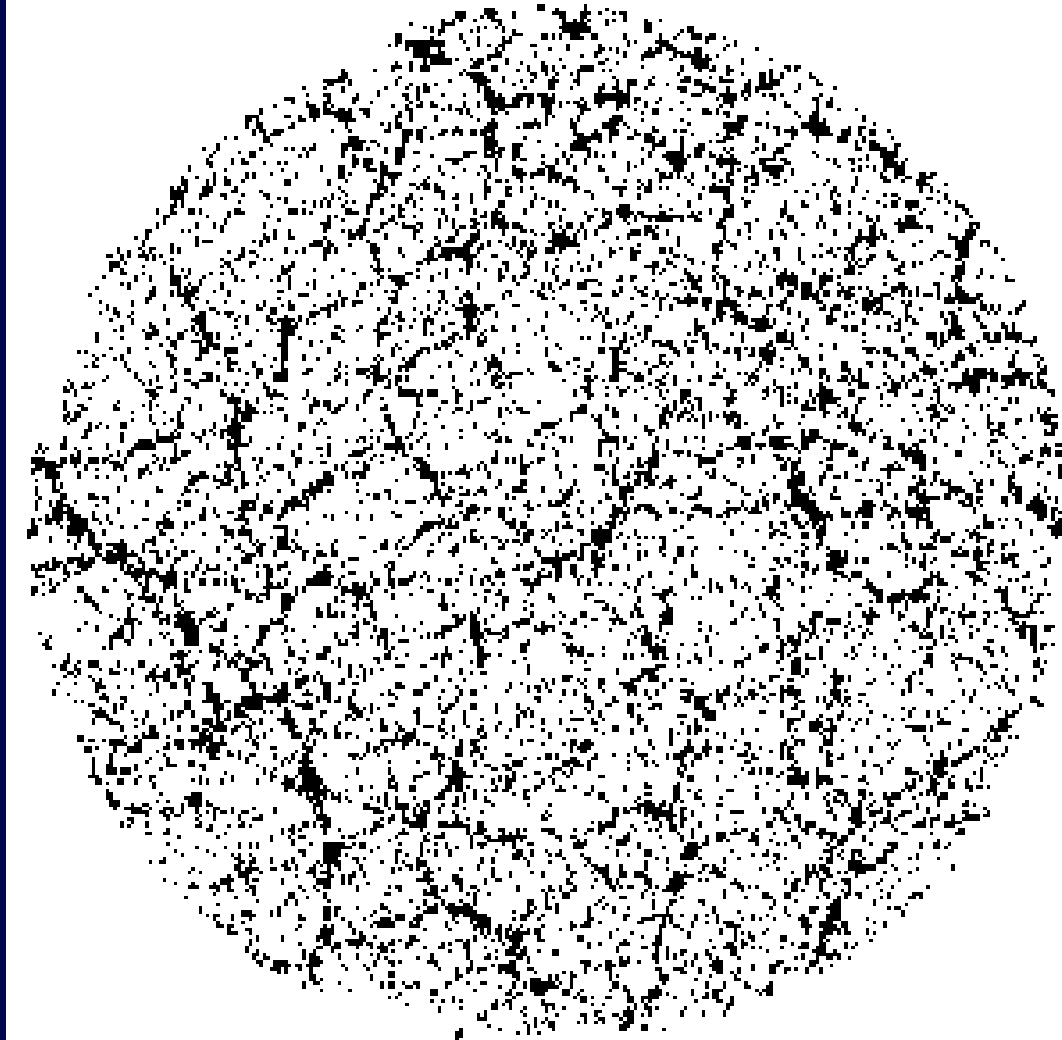


Redshift Space Distribution



# Redshift Distortions

0.00



## Peculiar Velocity Field

Measure the line of sight peculiar velocities:

$$v_p = cz - H_0 r$$

The difference between the redshift and the distance

### Why should we study $v_p$ ?

- ★ The peculiar velocity field is dominated by large scales



Linear structure

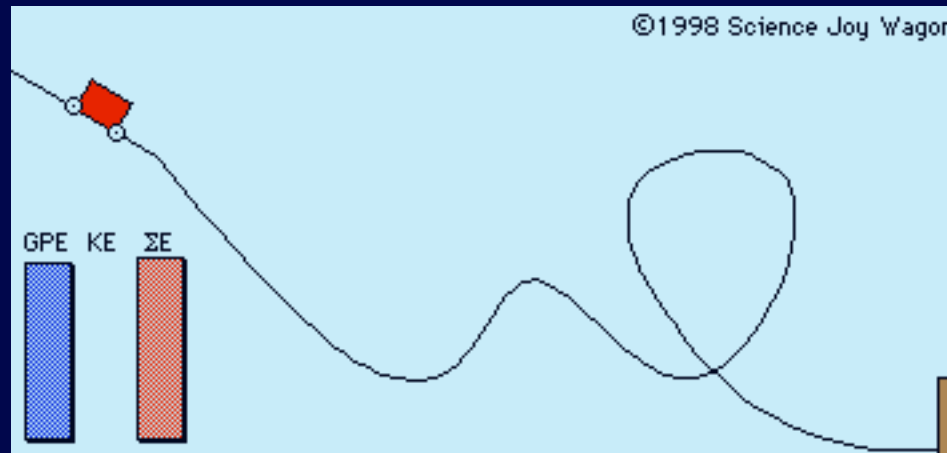
- ★ Test of gravitational instability model  $\vec{\nabla} \cdot \vec{V} = \frac{\delta\rho}{\rho}$      $\vec{\nabla} \times \vec{V} = 0$

- ★ A direct probe of the mass distribution  $\vec{V} = \vec{\nabla} \phi$

- ★ Comparison of velocity fields & Luminous matter distribution  bias,  $\Omega$  ...







★ A direct probe of the mass distribution

$$\vec{V} = \vec{\nabla} \phi$$





# How to measure cosmological distances?

## aka The Cosmic Distance Ladder

A stepwise procedure:      Errors proliferating

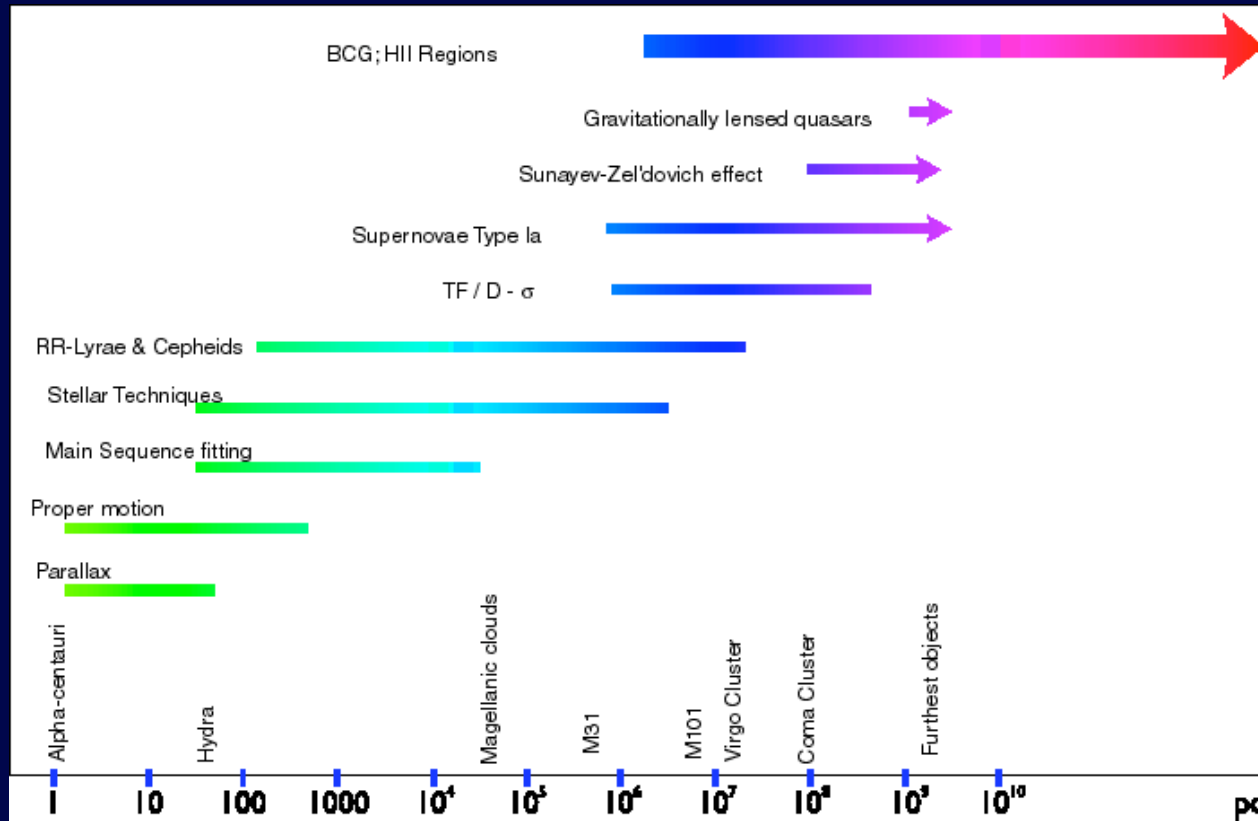
The idea:

Measure the apparent luminosity ( $\ell$ )

Get the distance

Find out absolute luminosity (L)

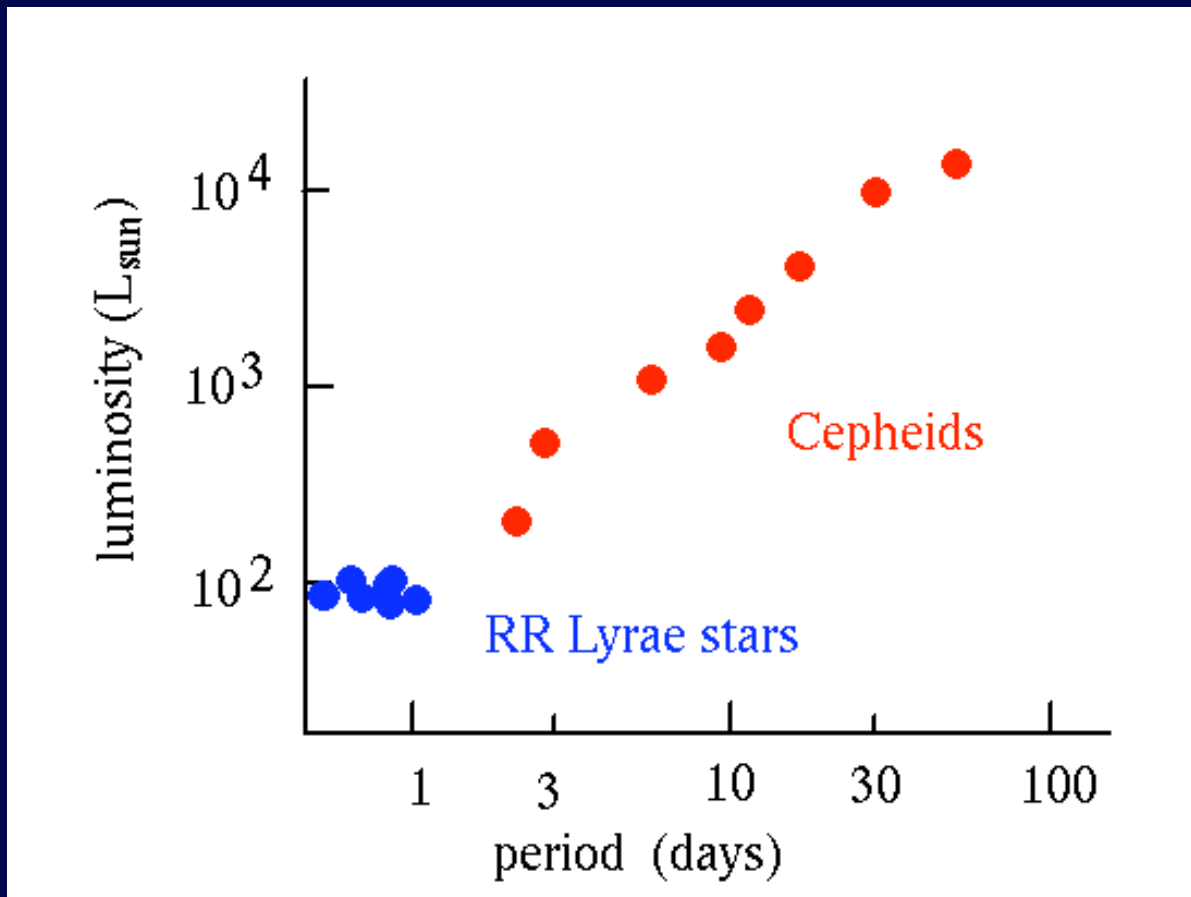
$$\ell = L / 4\pi r^2$$



# The Cosmic Ladder

- Find correlated observables:

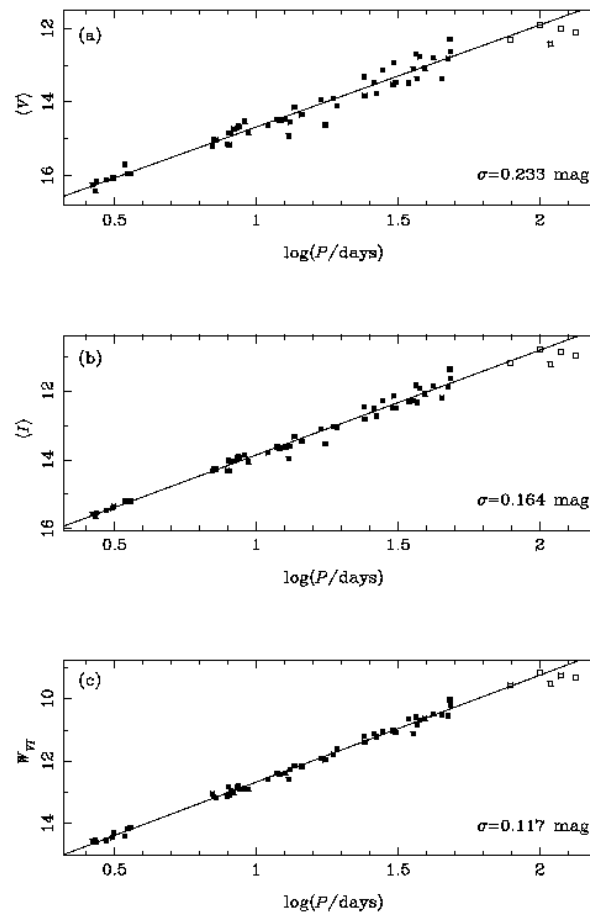
**Period – Luminosity** variable stars (Cepheids, RR-Lyr, ...)



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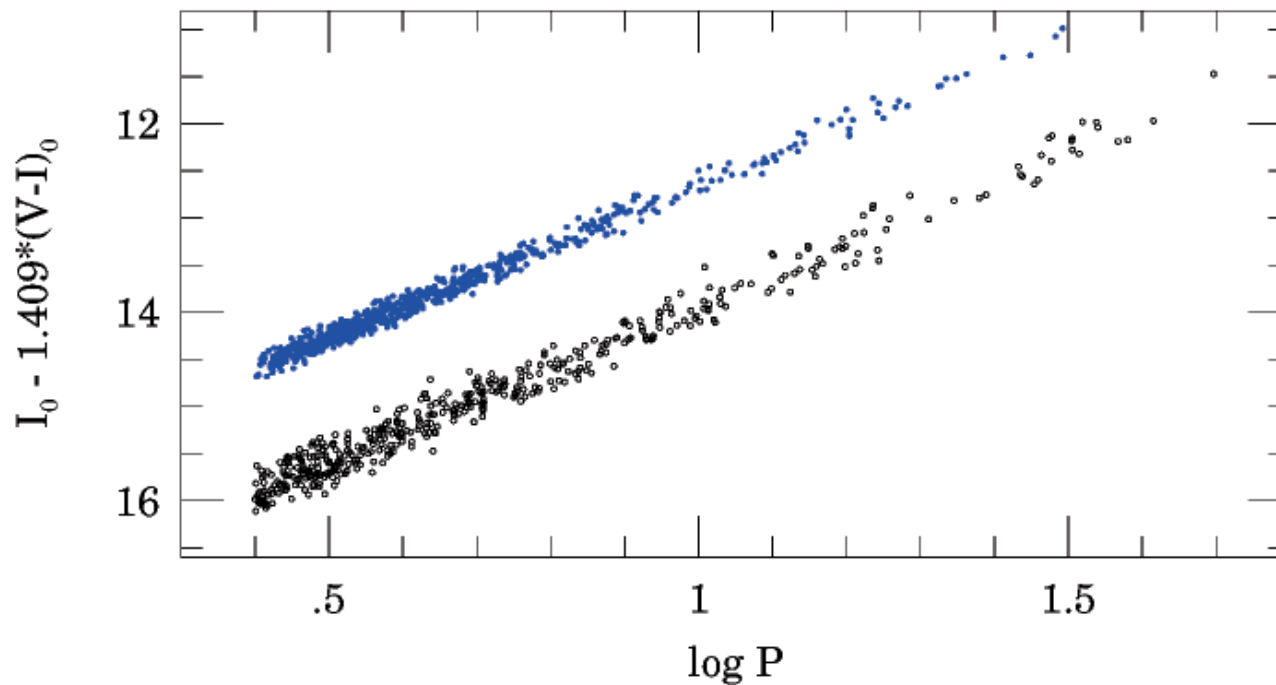
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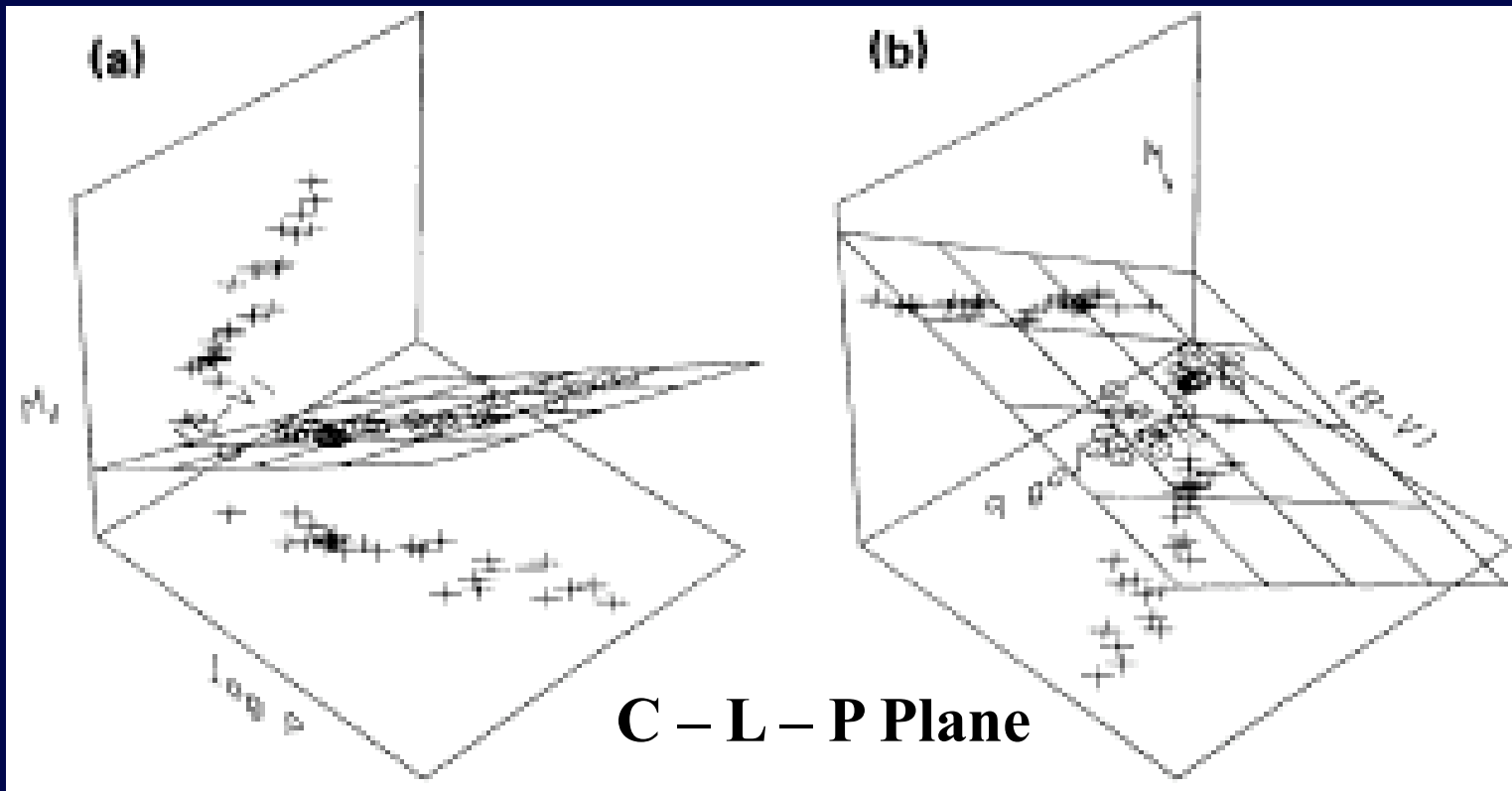
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# The Cosmic Ladder

- Find correlated observables:

**Period – Luminosity**    variable stars (Cepheids, RR-Lyr, ...)

- Use variable stars to find distances to distant galaxies
- Find other correlated observables:

• **Tully – Fisher**                      **Spiral galaxies**                       $L \propto v_r^4$



# Tully–Fisher

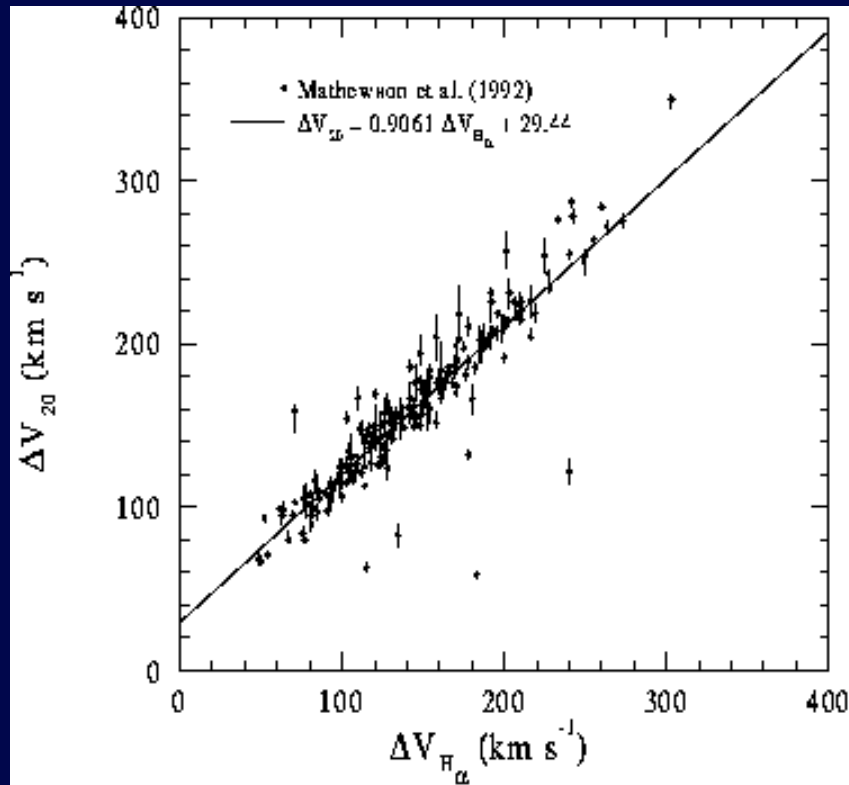
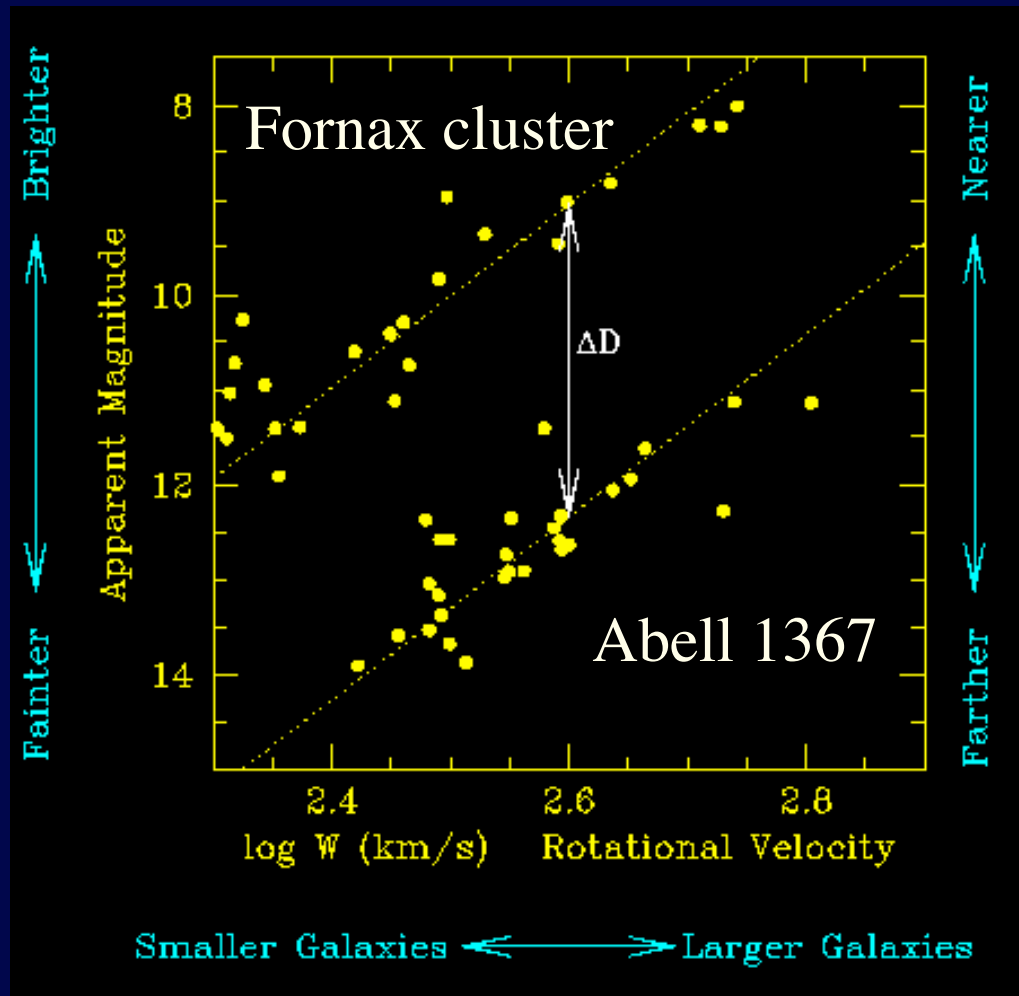


Figure 8.1: HI half-linewidth versus H $\alpha$  rotation velocity for a sample of 204 nearby galaxies. Data taken from Mathewson et al. (1992)



# Tully–Fisher



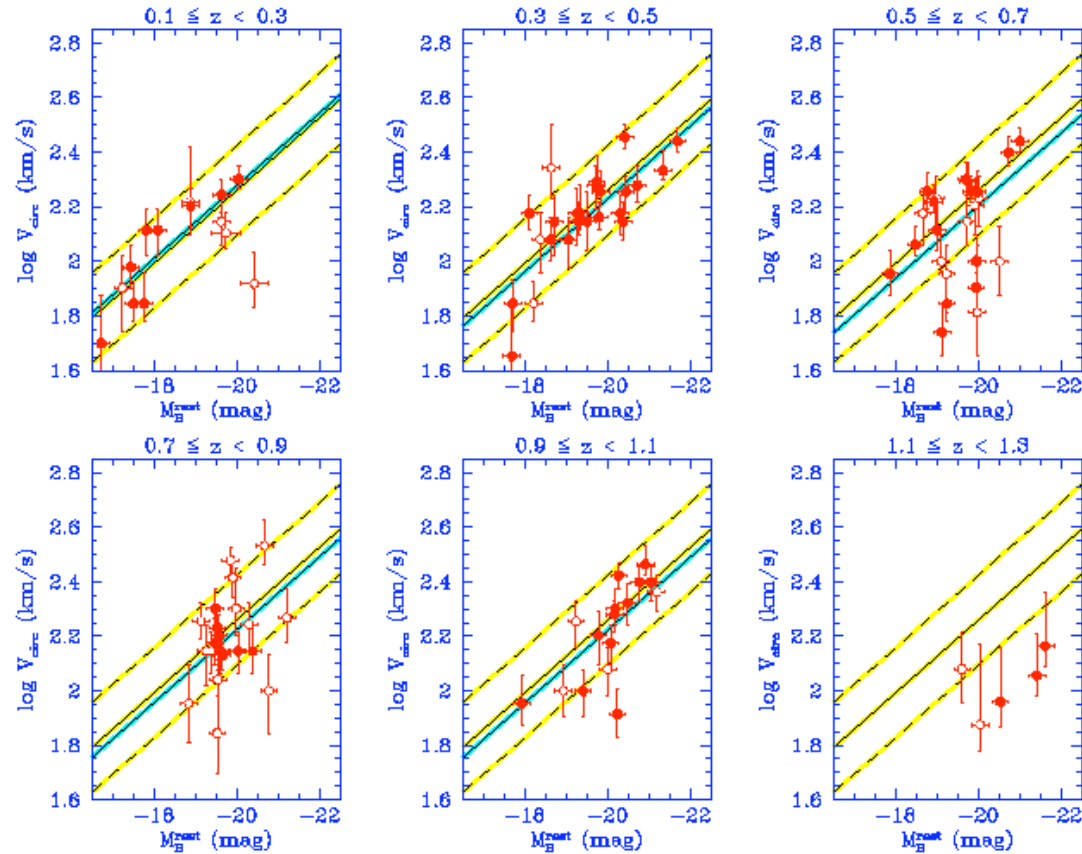
$\Delta D = \text{relative difference}$   
between the distances of  
the two clusters





# Tully–Fisher

Tully–Fisher (V–M) Relation



Vogt et al. 2000



# Tully-Fisher

8

I.D.Karachentsev et al.: The 2MASS TF relation for edge-on galaxies

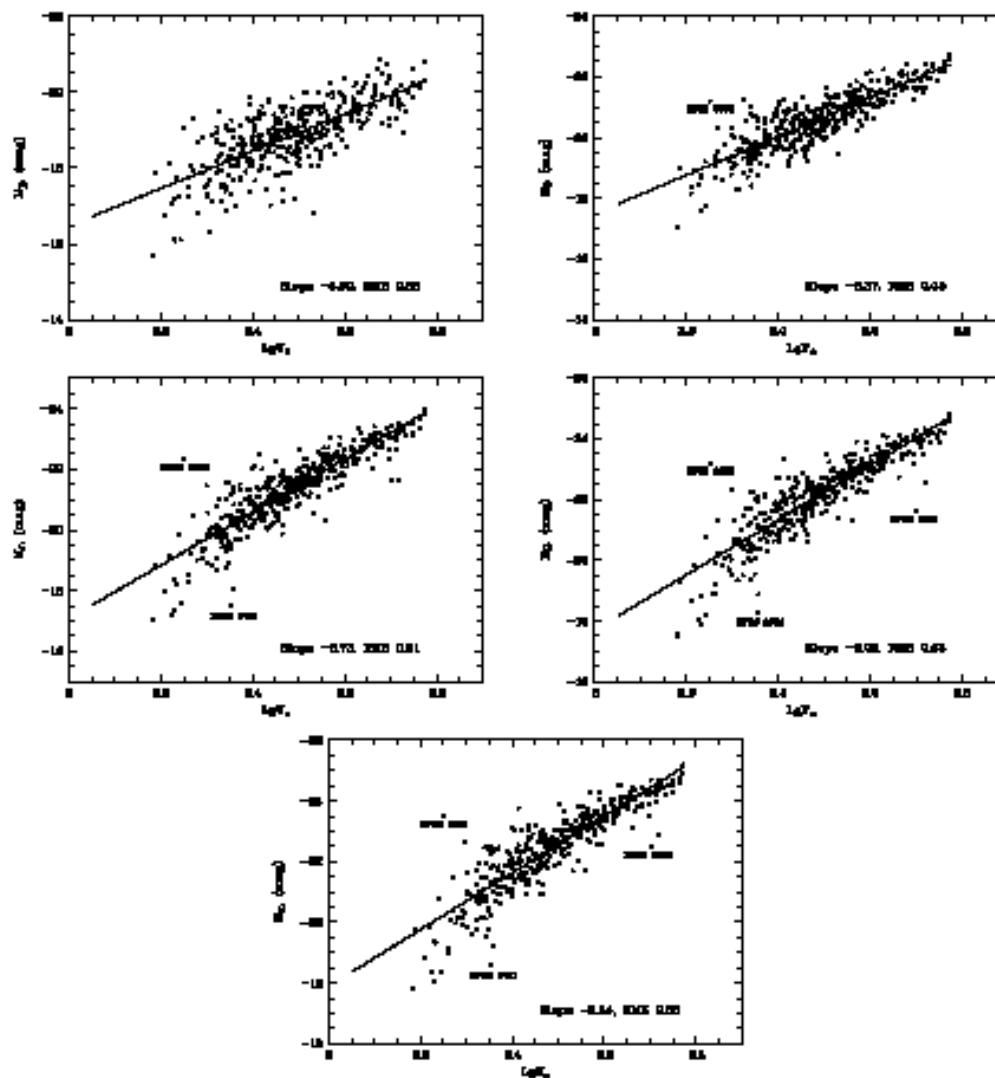


Fig. 8. Tully-Fisher relation for the RFGC galaxies in different photometric bands.



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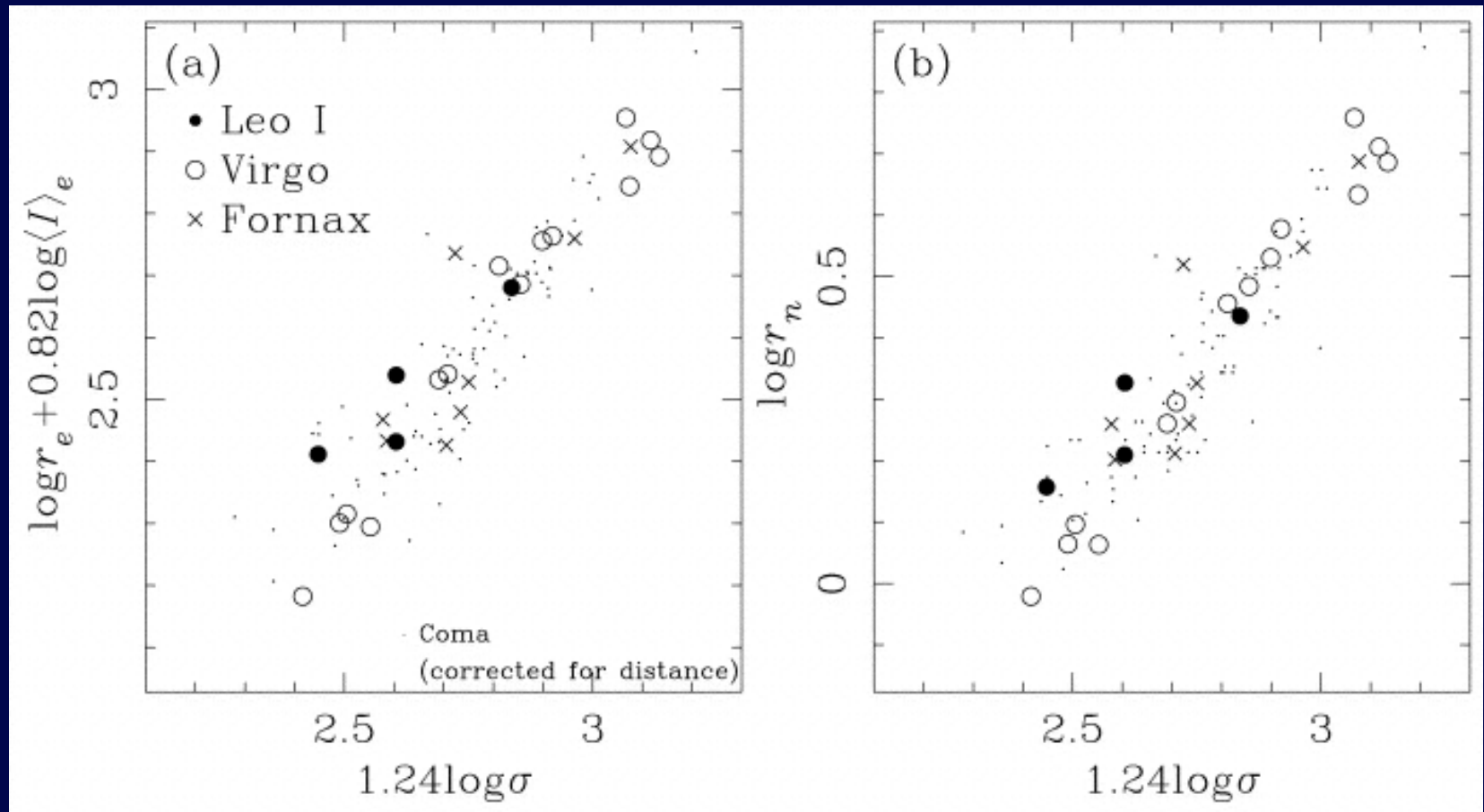
•  $D_n - \sigma$                       **Elliptical galaxies**                       $L@B_i \propto \sigma_v^4$

$$D_n \propto r_c < I >_c^{0.8}$$

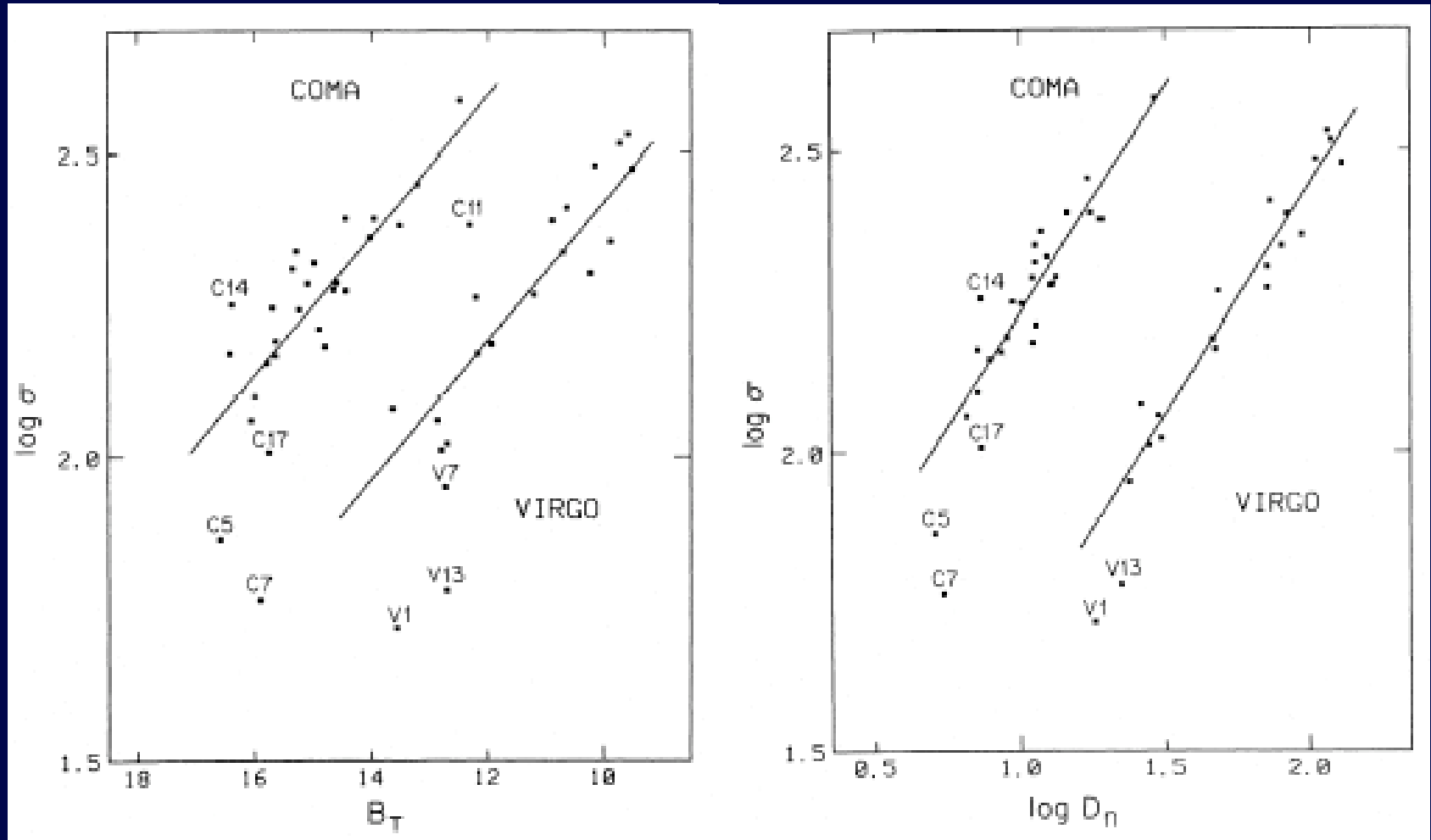
$$\log D_n = 1.333 \log \sigma + \text{constant}$$



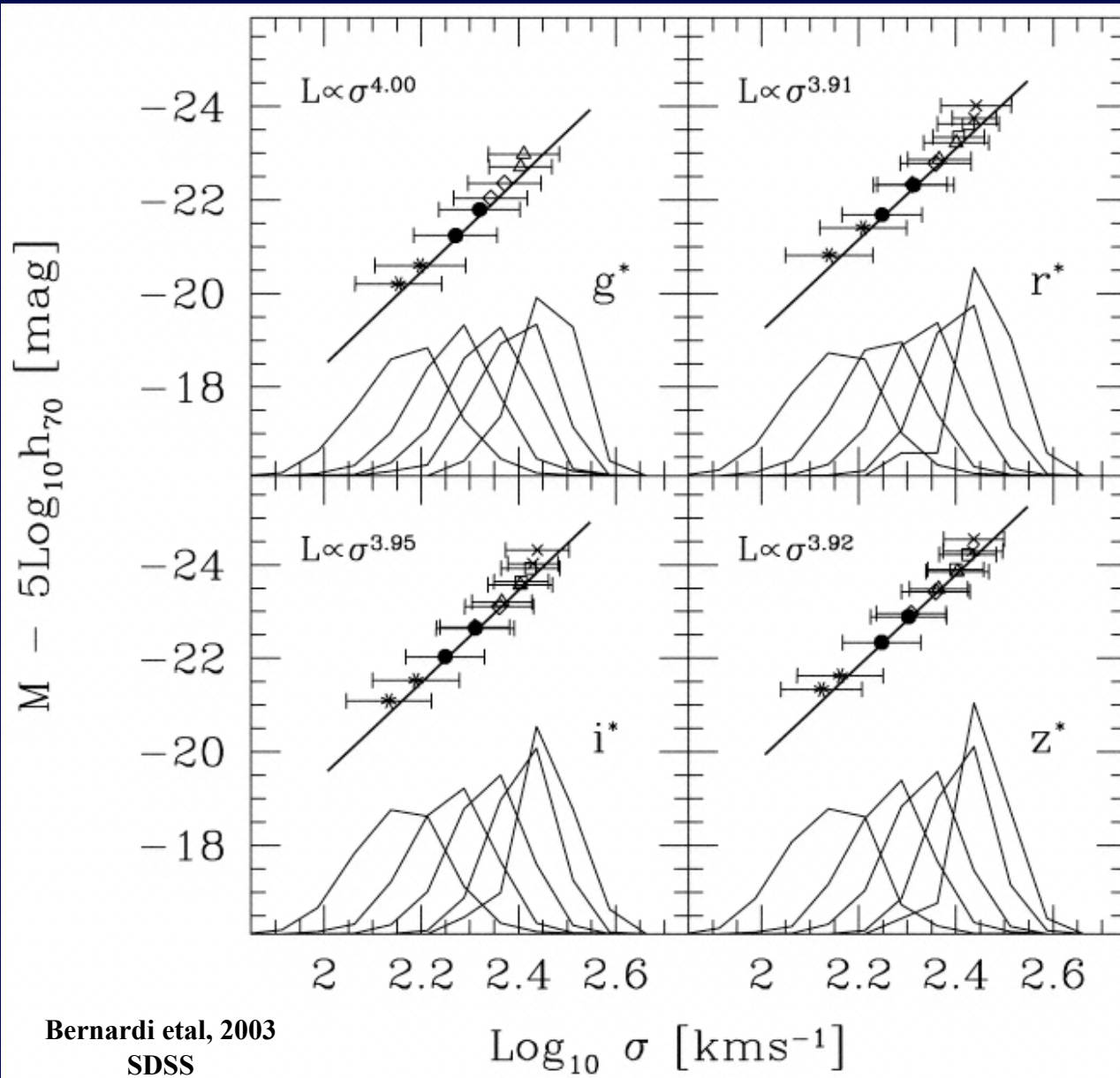
$$D_n - \sigma$$



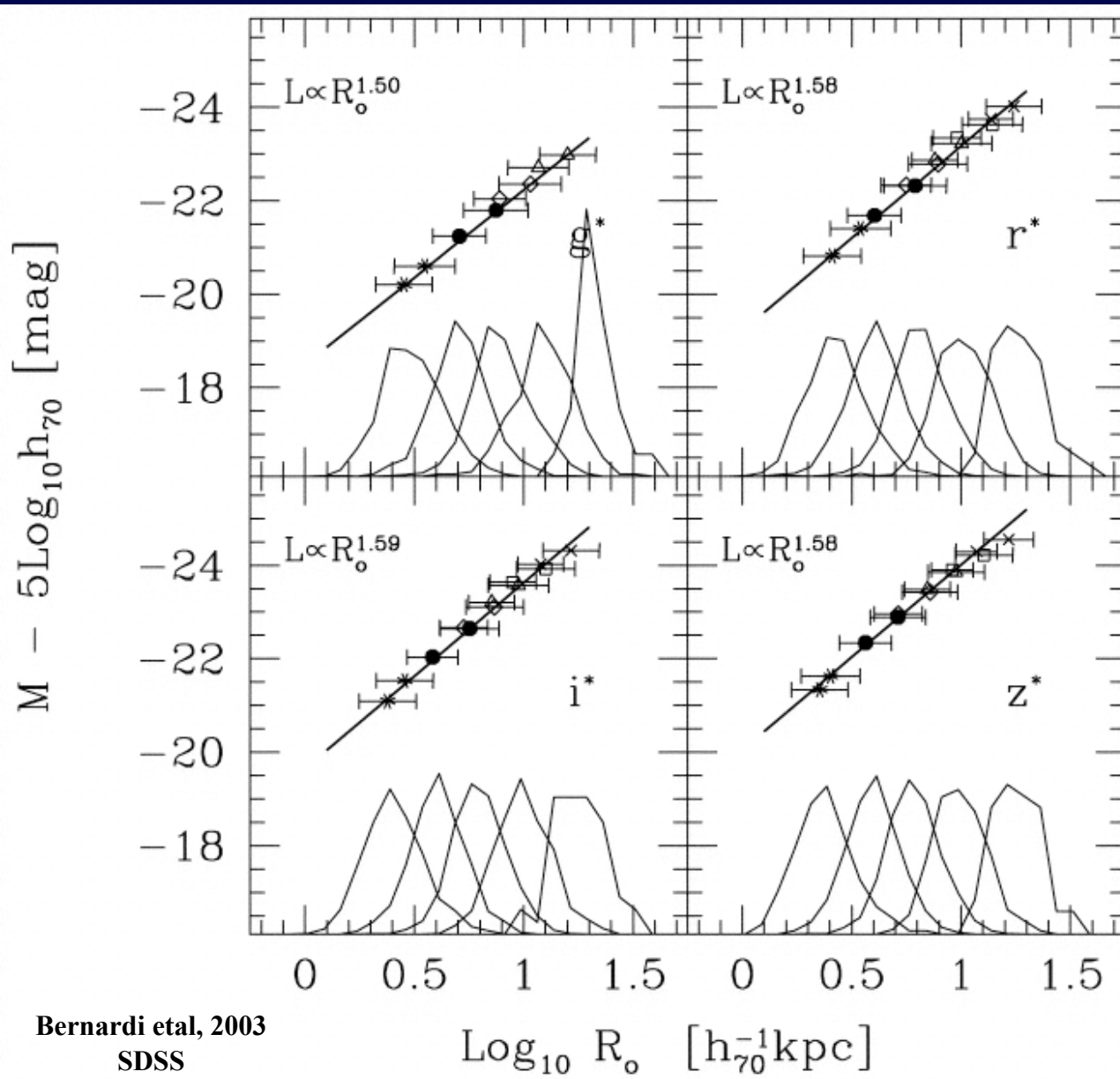
# $D_n - \sigma$



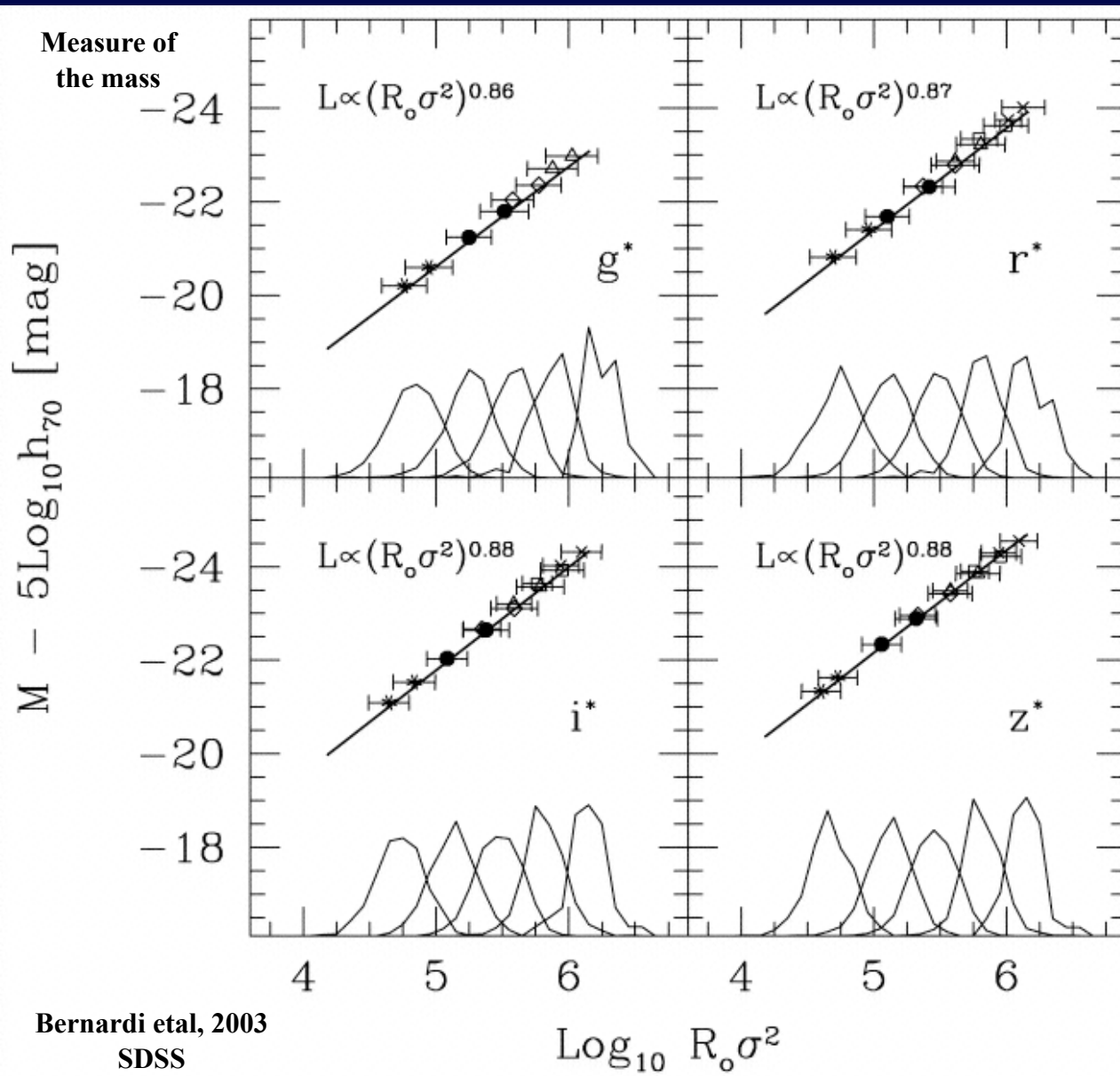
# $D_n - \sigma$



# $D_n - \sigma$



# $D_n - \sigma$





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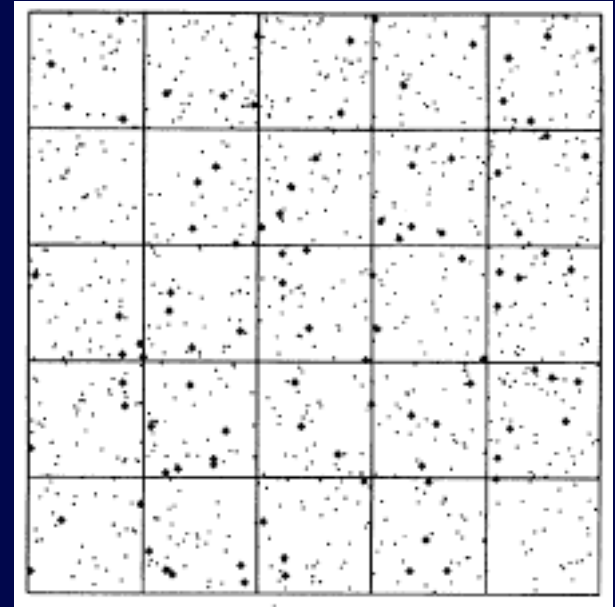
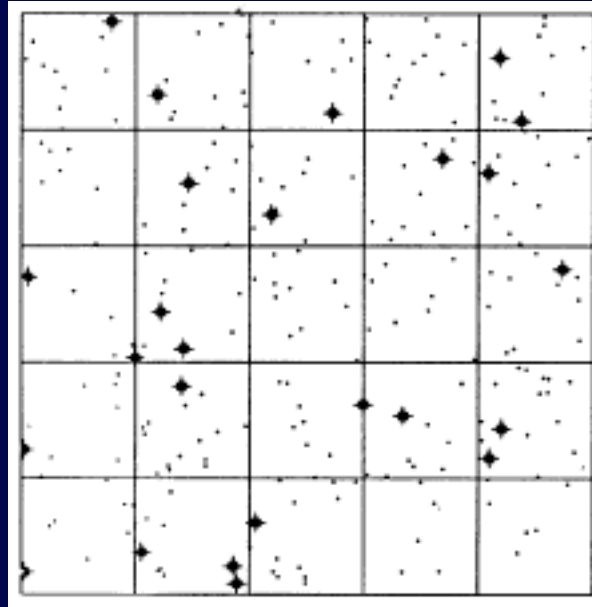
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• **Surface Brightness Fluctuations**



# The Cosmic Ladder

## Surface Brightness Fluctuations (SBF)



Measure: flux per pixel  $f_{av}$

rms fluctuations in flux between pixels

Mean:  $f_{av} \sim N f_{av}^* \sim d^2 d^{-2} \sim \text{constant}$

Variance:  $\sigma^2 \sim N (f_{av}^*)^2 \sim d^{-2}$

rms:  $\sigma \sim d^{-1}$



A galaxy twice as far is twice as smooth



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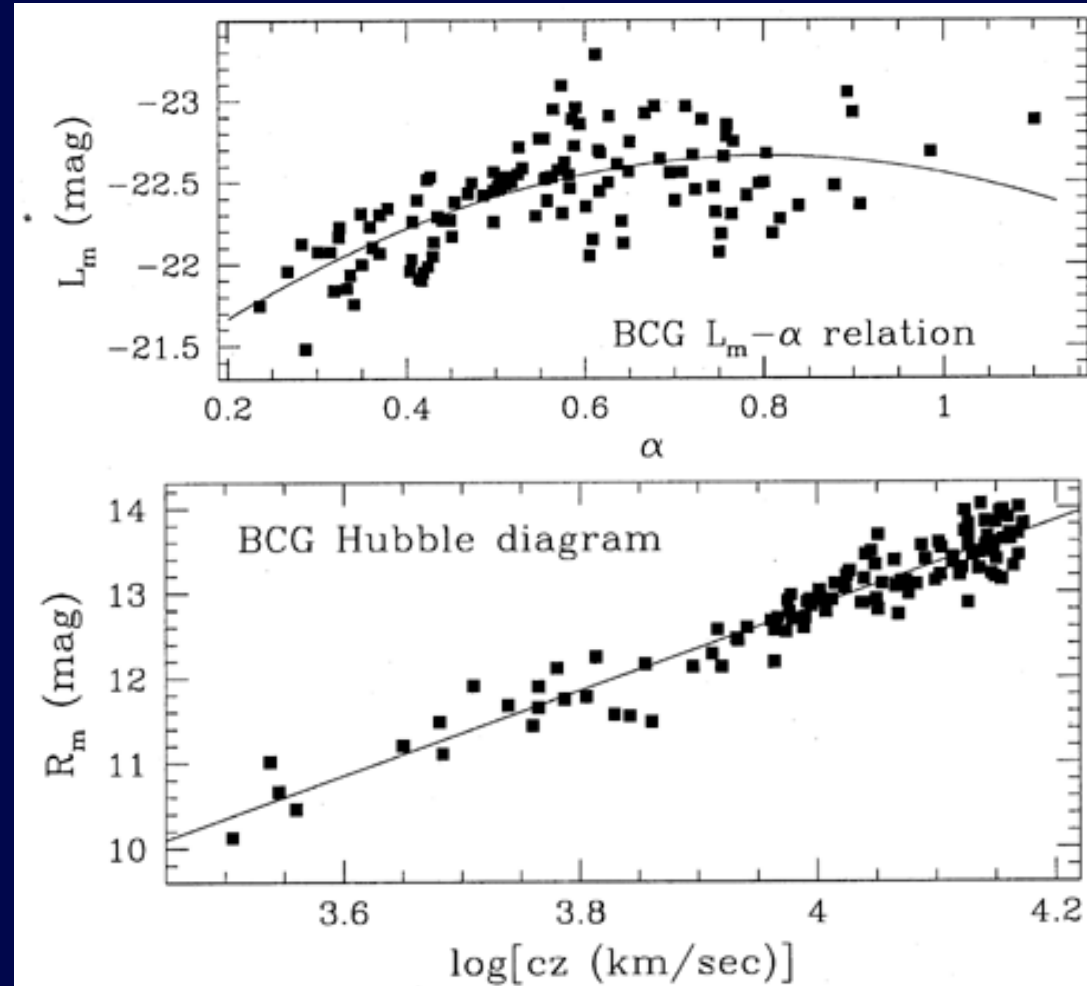
• **Brightest Cluster Galaxy**                      **Metric luminosities**

# The Cosmic Ladder

- **Brightest Cluster Galaxy**

$$\alpha \equiv \left. \frac{d \log(L_m)}{d \log(r)} \right|_{r_{10}}$$

Metric luminosities



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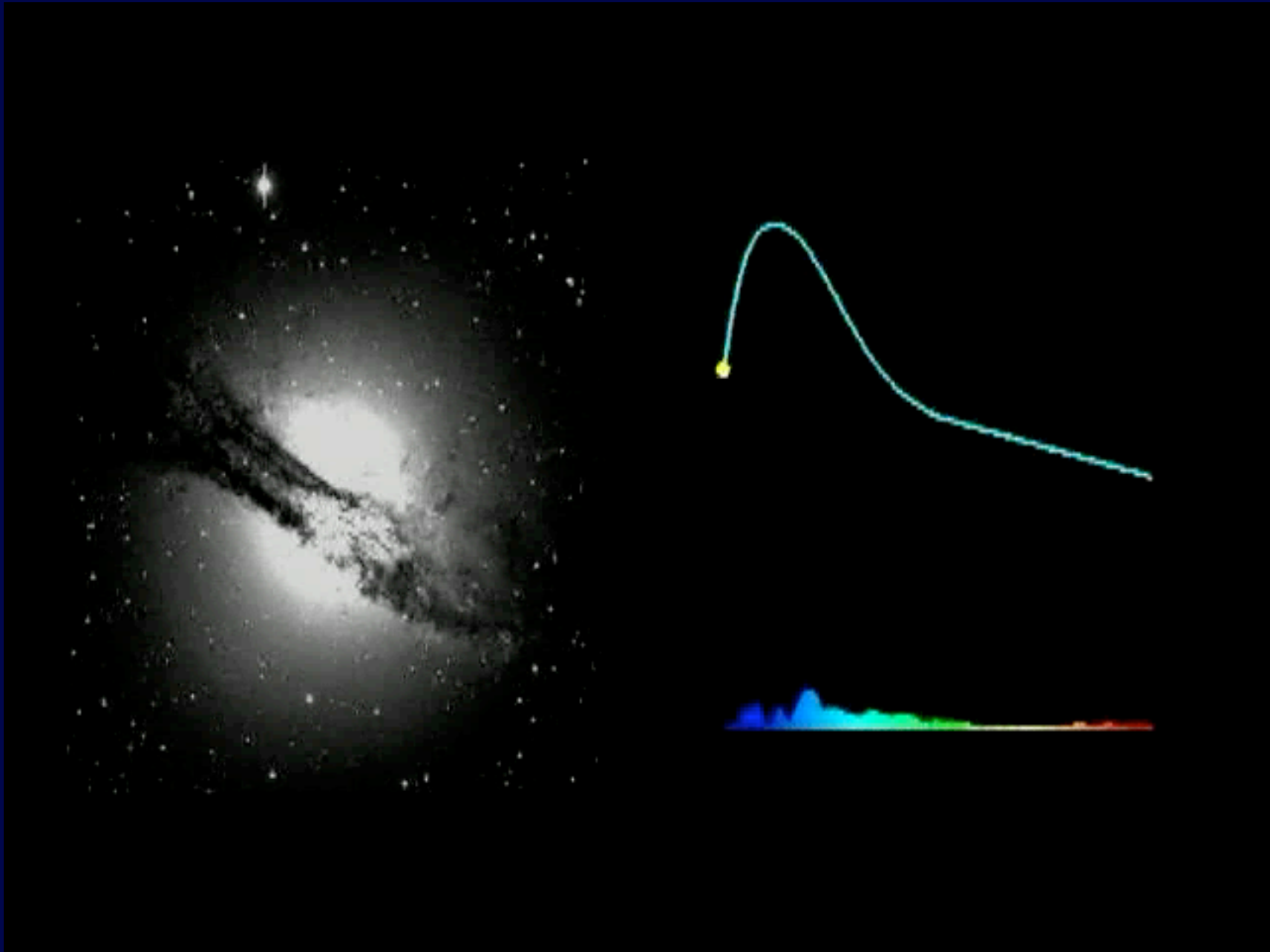
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• **Surface Brightness Fluctuations**

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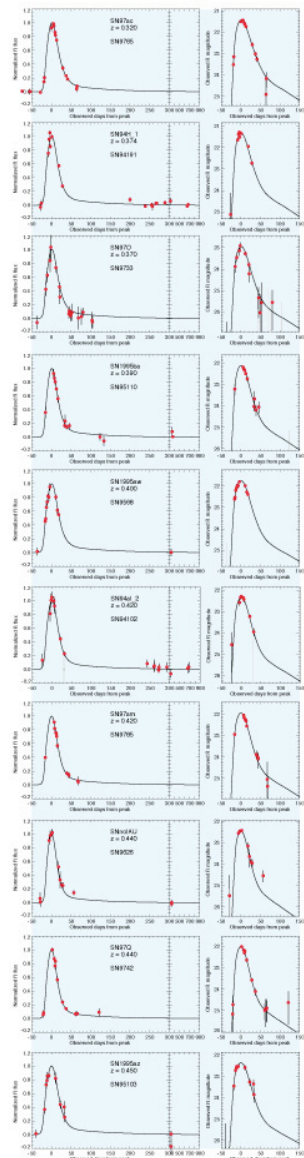
• **Supernaovae Type Ia**                      **Light Curve Shapes**





# Type Ia Supernovae

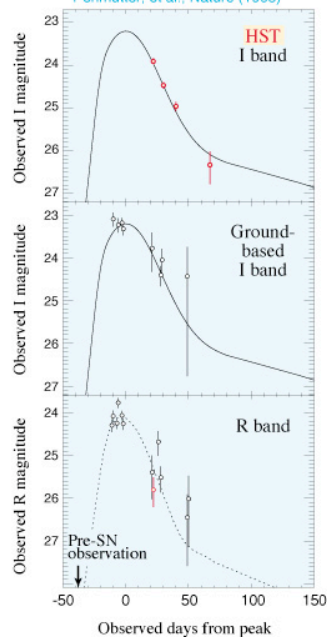
from  $z = 0.32 \dots$   
observed from the ground



## Light Curves

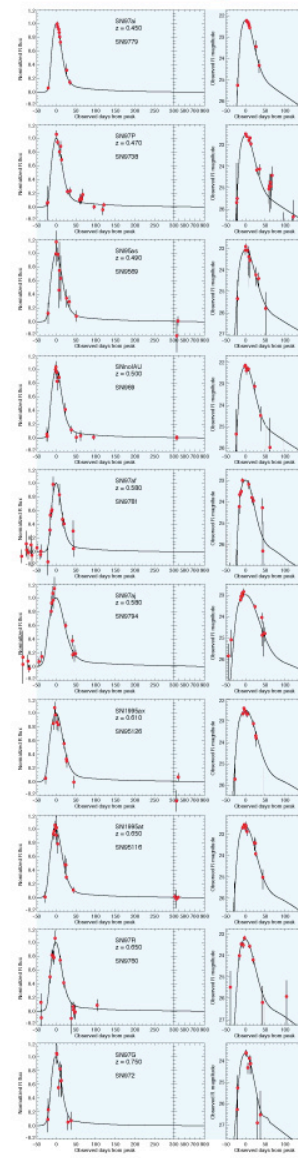
SN 1997ap at  $z = 0.83$   
observed from the  
ground and with the HST

Perlmutter, et al., Nature (1998)



We observe most of the supernovae for approximately two months in both the R and I bands (corresponding approximately to the restframe B and V bands for the median redshift). At high redshifts, a significant fraction of this host galaxy light is within the seeing disk of the supernova, so final observations about one year later are usually necessary to observe (and subtract) the host galaxy light after the supernova has faded. The plots to the left and the right show just the R band light curves for about half of the 40 supernovae that have been completely observed and analyzed so far. The plots above show the highest redshift spectroscopically confirmed supernova, which was observed with the Hubble Space Telescope.

$\dots$  to  $z = 0.75$   
observed from the ground



C. Pennypacker

M. DellaValle  
Univ. of Padova

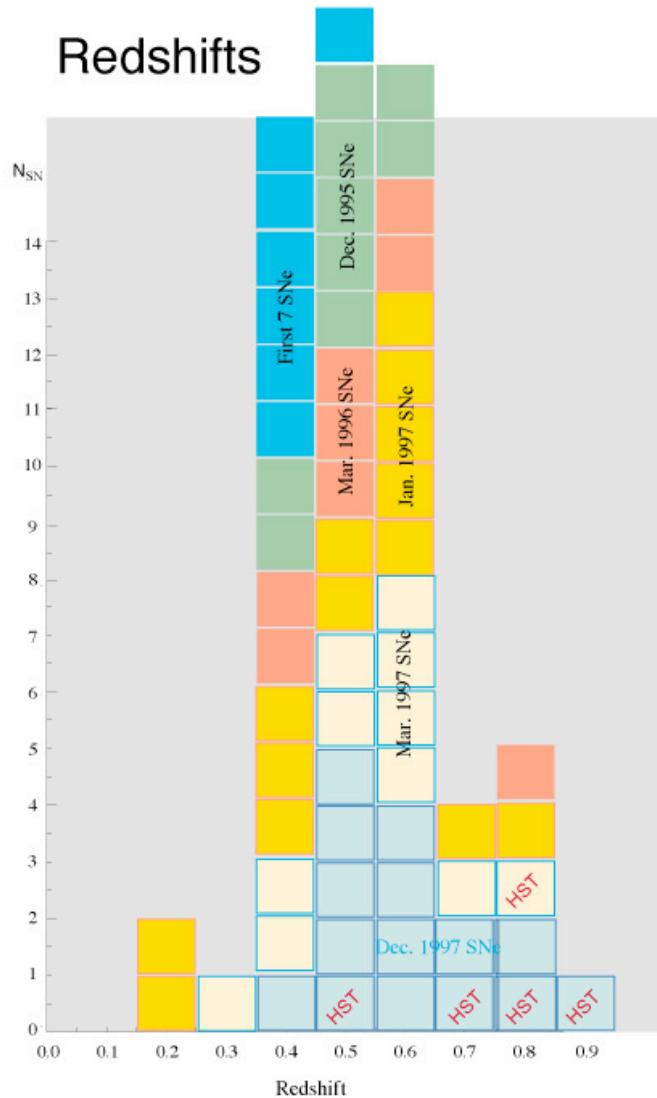
R. Ellis, R. McMahon  
IoA, Cambridge

B. Schaefer  
Yale University

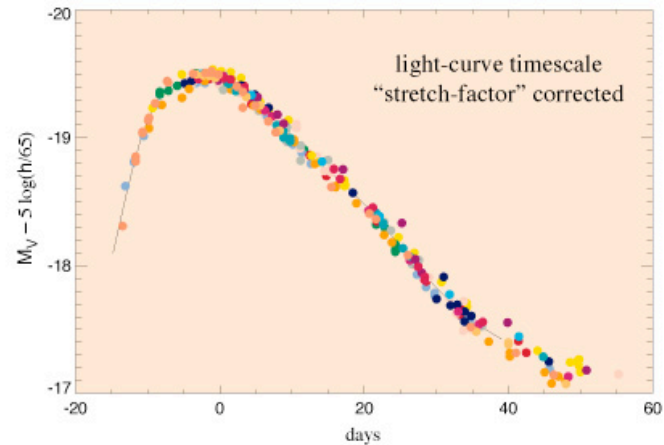
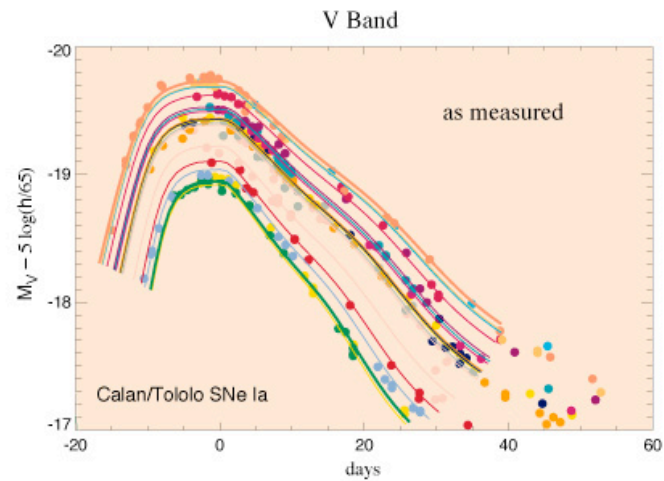
P. Ruiz-Lapuente  
Univ. of Barcelona

H. Newberg  
Fermilab

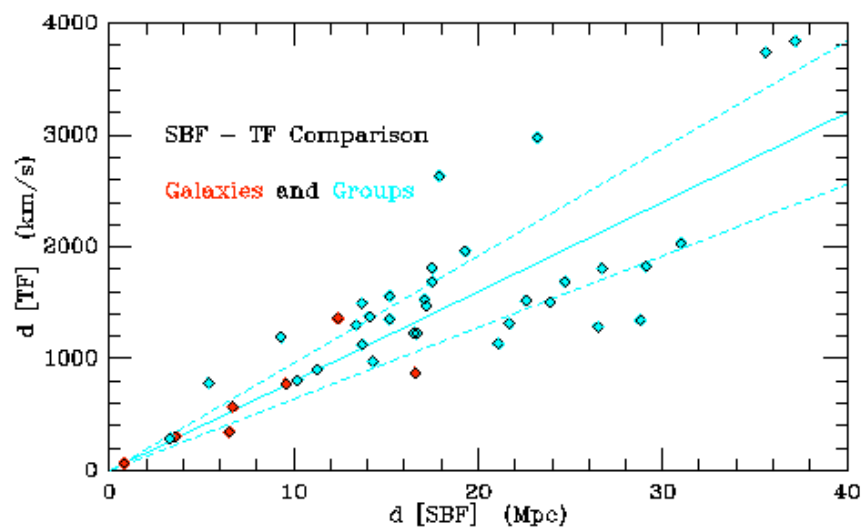
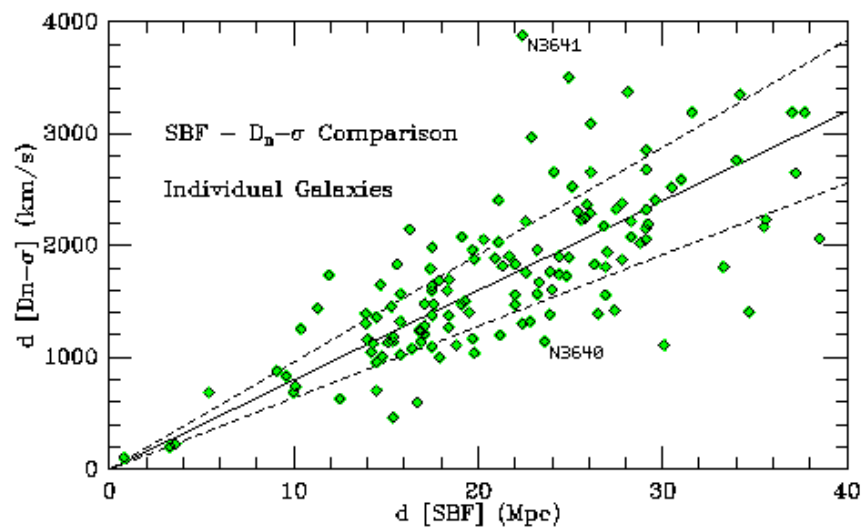
## Redshifts



## Low Redshift Type Ia Template Lightcurves







# The Cosmic Ladder

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• **Surface Brightness Fluctuations**                       $\alpha \equiv d\log(L_m)/d\log(r) |_{r_{10}}$

• **Brightest Cluster Galaxy (BCG)**                      **Metric luminosities**

• **Supernaovae Type Ia (SNIa)**                      **Light Curve Shapes**

• **Sunayev–Zeldovich Effect (SZE)**                      **Cluster distances**



# SZ Effect

CMB photons Compton scatter on hot electrons in clusters.

Thermal SZE:

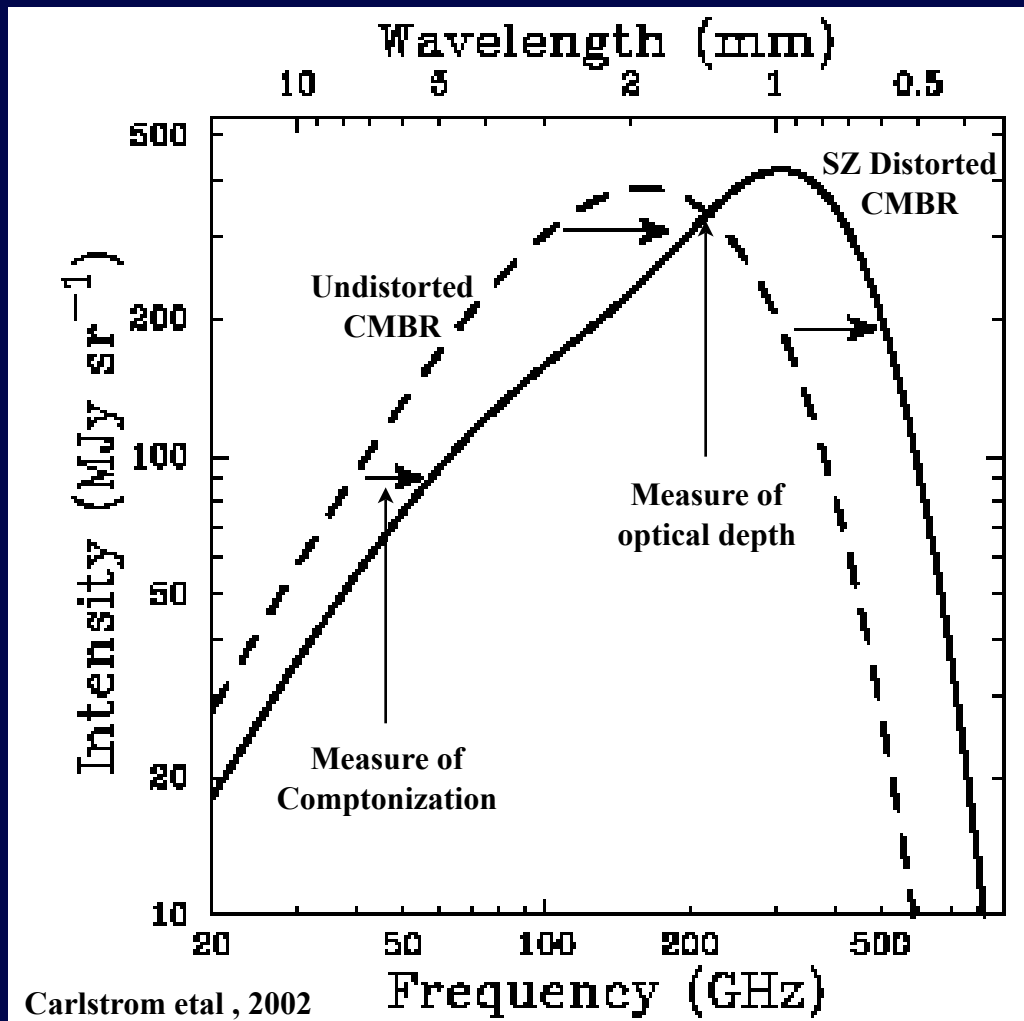
The high  $T$  (keV)  $e^-$  increase  $E_\gamma \Rightarrow$  non-thermal spectrum

Kinetic SZE:

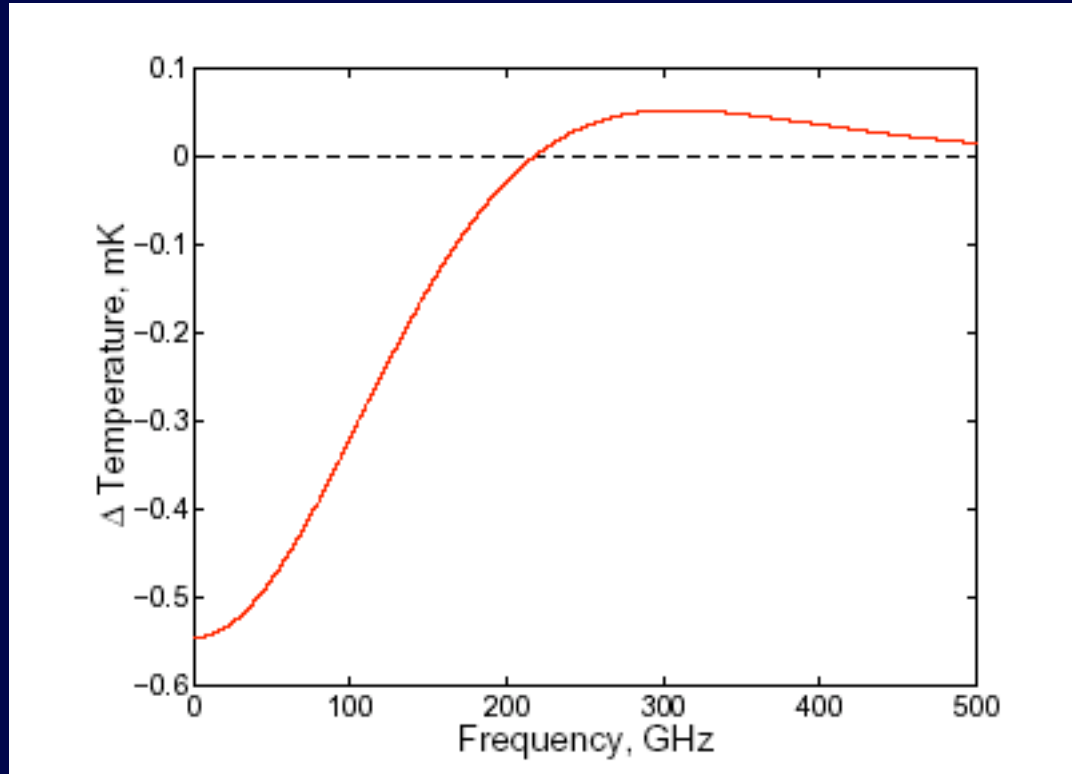
The bulk motion of the cluster red- or blue-shifts scattered  $\gamma$



# SZ Effect



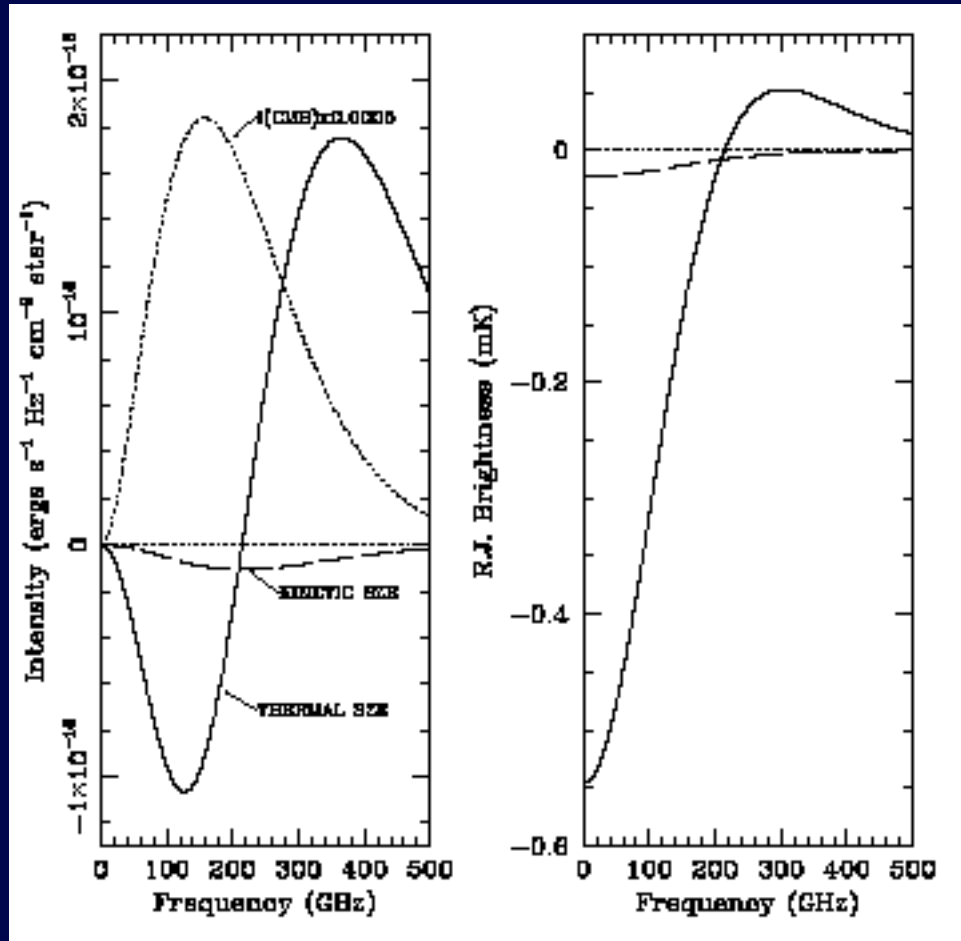
# SZ Effect



SZE Spectral Distortion of the CMBR due to hot ionized gas associated with a cluster of galaxies



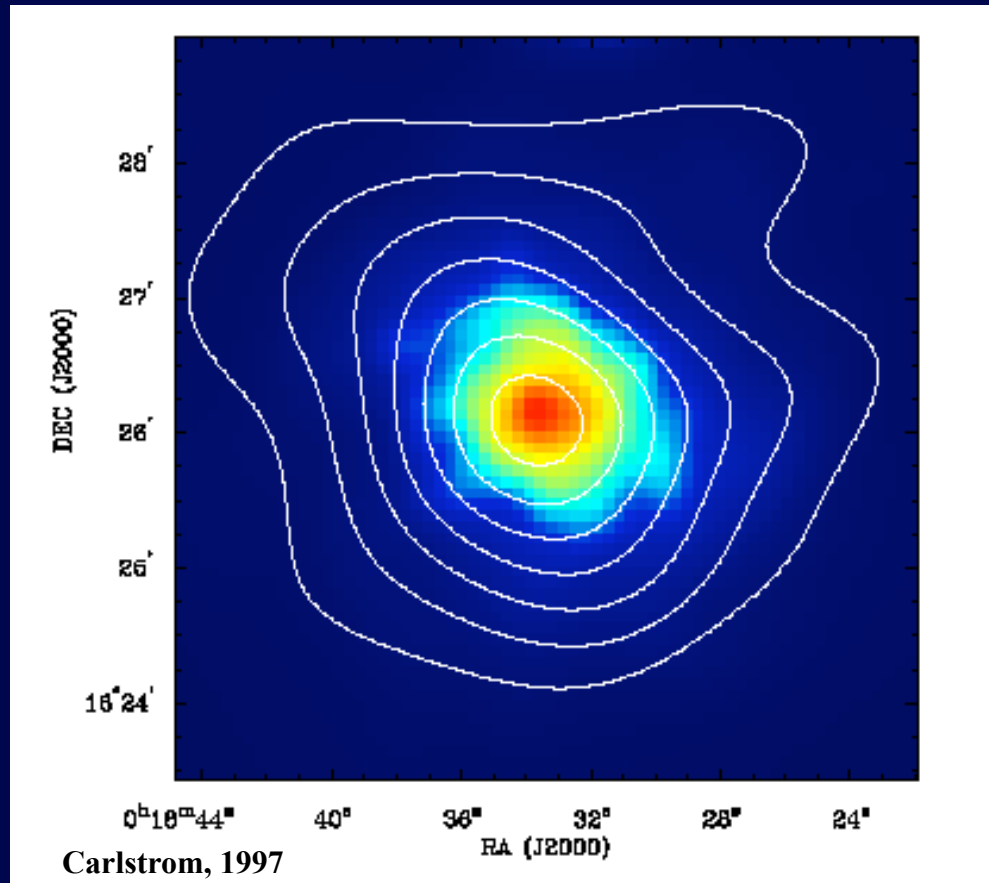
# SZ Effect



$$T_{e-} = 10 \text{ keV} \quad y = 10^{-4} \quad v_{pec} = 500 \text{ km/s}$$



# SZ Effect



SZE (contours) and X-ray emission (colors) due to hot gas in cluster 0016+16 ( $z=0.5455$ ) with  $L_{cl} \approx 10^{12} L_{\odot}$ .

The cluster appears as a hole in the CMBR



To study the velocity field we first look at

## Bulk Flows

At great distances we cannot measure the distances accurately

e.g.

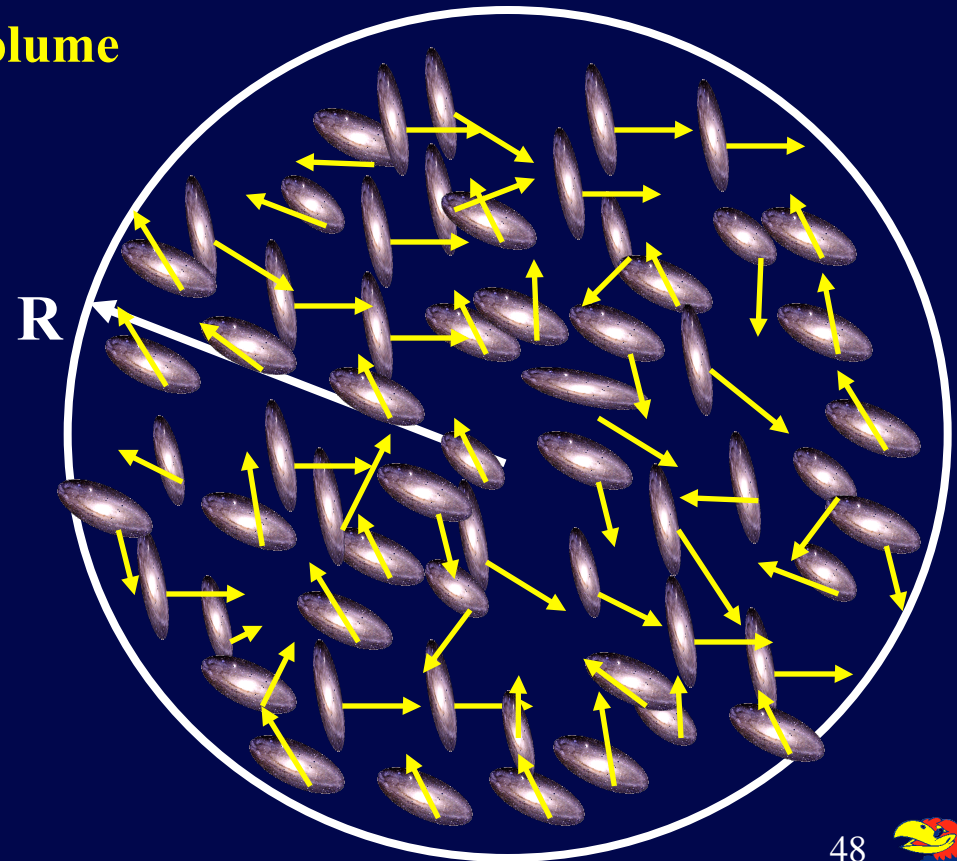
At  $10,000 \text{ km / s}$  ( $100 \text{ h}^{-1} \text{ Mpc}$ )  
uncertainty of 10%  $\rightarrow 1,000 \text{ km / s}$

We want to measure peculiar velocities of

$\leq 500 \text{ km / s}$

Combine data to find net motion of a volume

Beat down the error by  $\sqrt{N}$



As  $R$  becomes large, expect  $v_p \rightarrow 0$

Test homogeneity





## Applications

1975 – Rubin & Ford:

Sc Galaxies ( $H_0 r \leq 10,000$  km/s)

$V_{LG} \sim 550$  km/s



## Applications

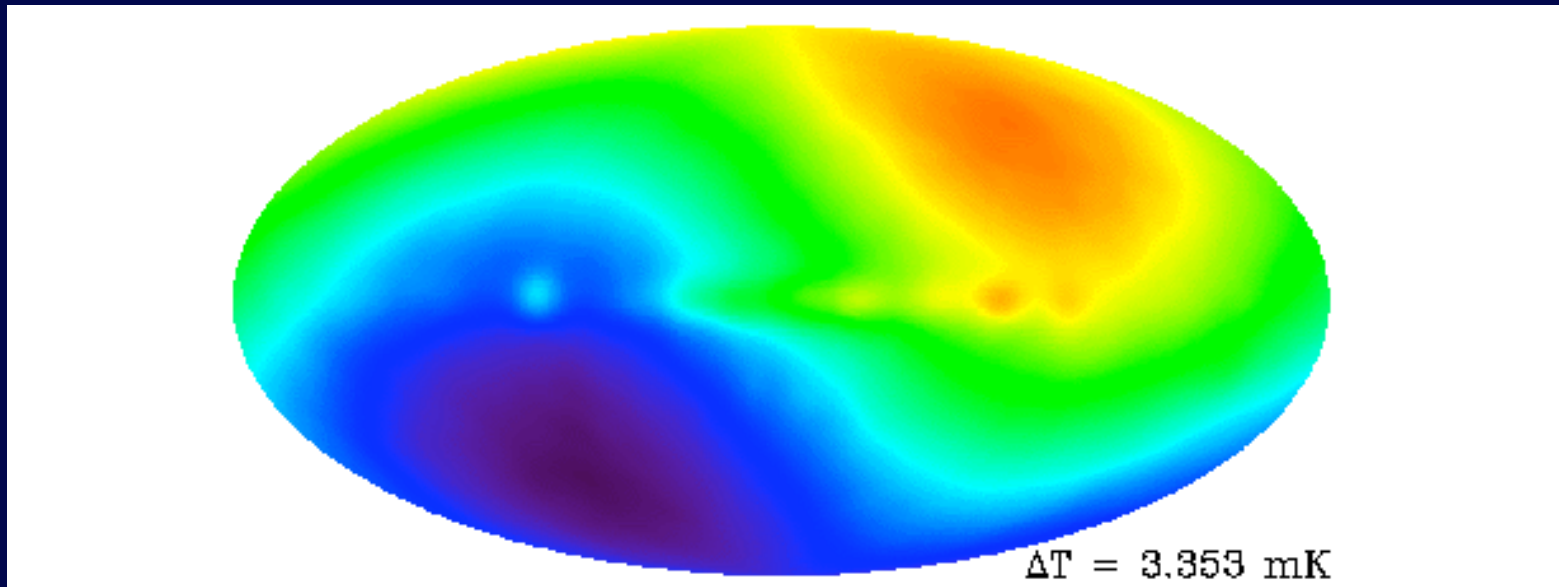
**1975 – Rubin & Ford:**

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$V_{LG} \sim 550$  km/s

**1976 – CMB Dipole:**

$V_{LG} \sim 620$  km/s



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**1987 – 7 Samurai:**

**$D_n - \sigma$  ( $H_0 r \leq 6,000$  km/s)**

**$V_{7SIF} \sim 550$  km/s (Great attractor!)**



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**1993 – Lauer & Postman**

BCG ( $H_0 r \leq 15,000$  km/s)

$V_{ACIF} \sim 700$  km/s (Enormous attractor?)



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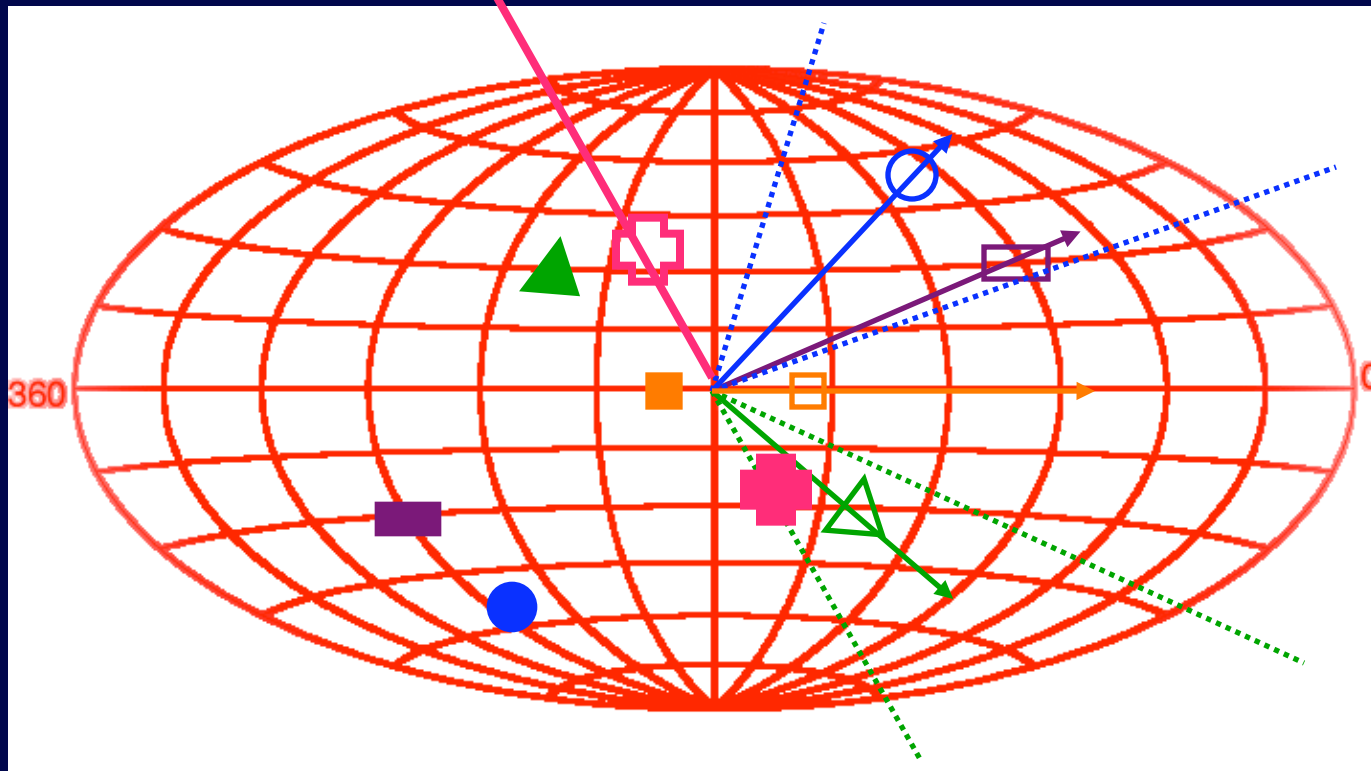
**1993 – RPK**

SN Ia ( $H_0 r \leq 10,000$  km/s)

$V_{SNIF} \sim 400$  km/s (No attractor?)



# Local Group Velocity



Survey	$l$	$b$	$v_p$
$V_{CMR}$	$271^{\circ}$	$+29^{\circ}$	620 km / s
$V_{LP}$	$220^{\circ}$	$-28^{\circ}$	$561 \pm 284$ km / s
$V_{RPK}$	$260^{\circ}$	$+54^{\circ}$	$600 \pm 350$ km / s
$V_{SMAC}$	$195^{\circ}$	$0^{\circ}$	$700 \pm 250$ km / s
$V_{LP10k}$	$173^{\circ}$	$+63^{\circ}$	$1000 \pm 500$ km / s
$V_{SC}$	$180^{\circ}$	$0^{\circ}$	$100 \pm 150$ km / s



# Recent Large-Scale Bulk Flow Results

Survey	Method	N	Depth km/s	V km/s	Random err (km/s)	l	b
LP	BCG	119	8400	830	220	330	39
SC	TF	63	7000	80	100	290	20
Willick	TF	15	11000	1100	450	270	27
SMAC	FP	56	6000	650	180	260	-4
EFAR	FP	49	9300	650	350	50	10
SN Ia	SN Ia	65	10000	530	200	313	9

 New: Tonry (2003)  $6000 \text{ km/s} < H_d < 30000 \text{ km/s}$

# Errors Including Sampling

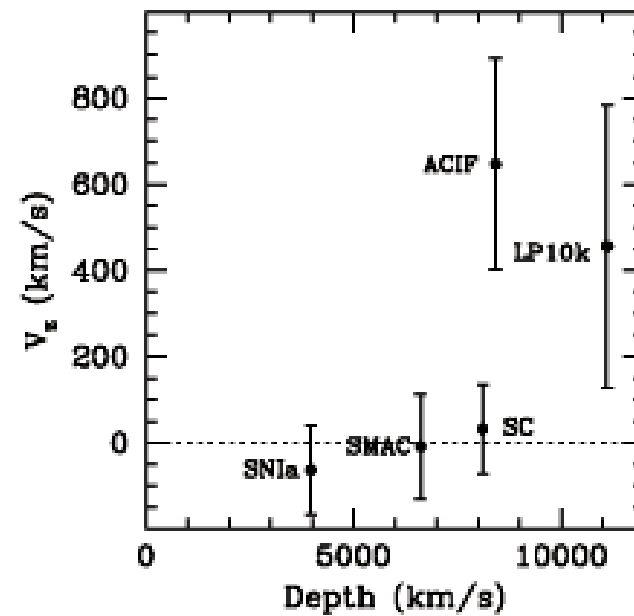
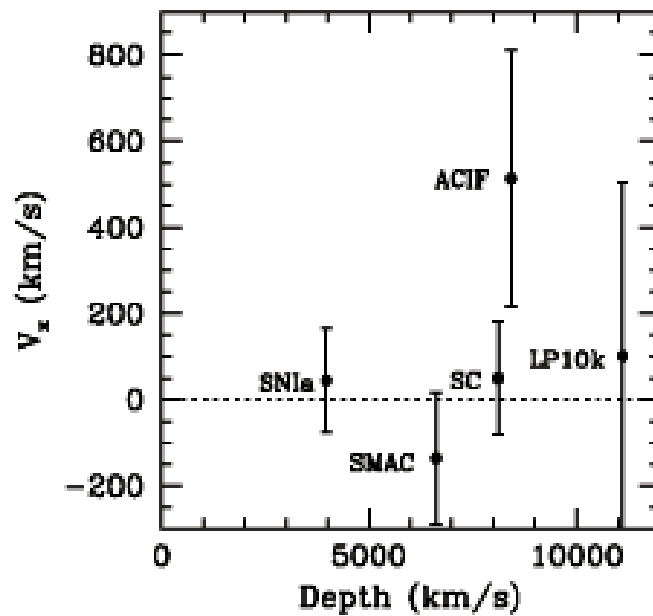
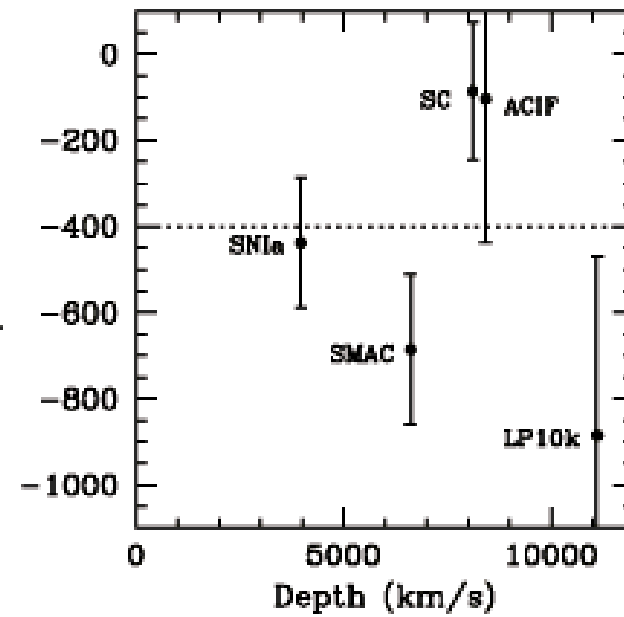
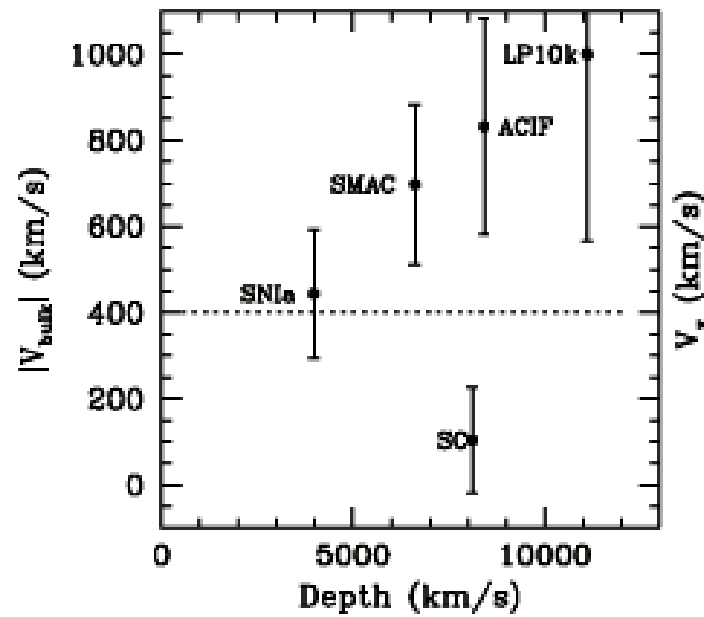
.. following analysis of Kaiser, Watkins & Feldman

Survey	Method	V km/s	Random err (km/s)	Sampling err (km/s)	l	b
LP	BCG	830	220	110	330	39
SC	TF	80	100	170	290	20
Willick	TF	1100	450	220	270	27
SMAC	FP	650	180	180	260	-4
EFAR	FP	650	350	210	50	10
SNIa	SNIa	530	200	130	313	9

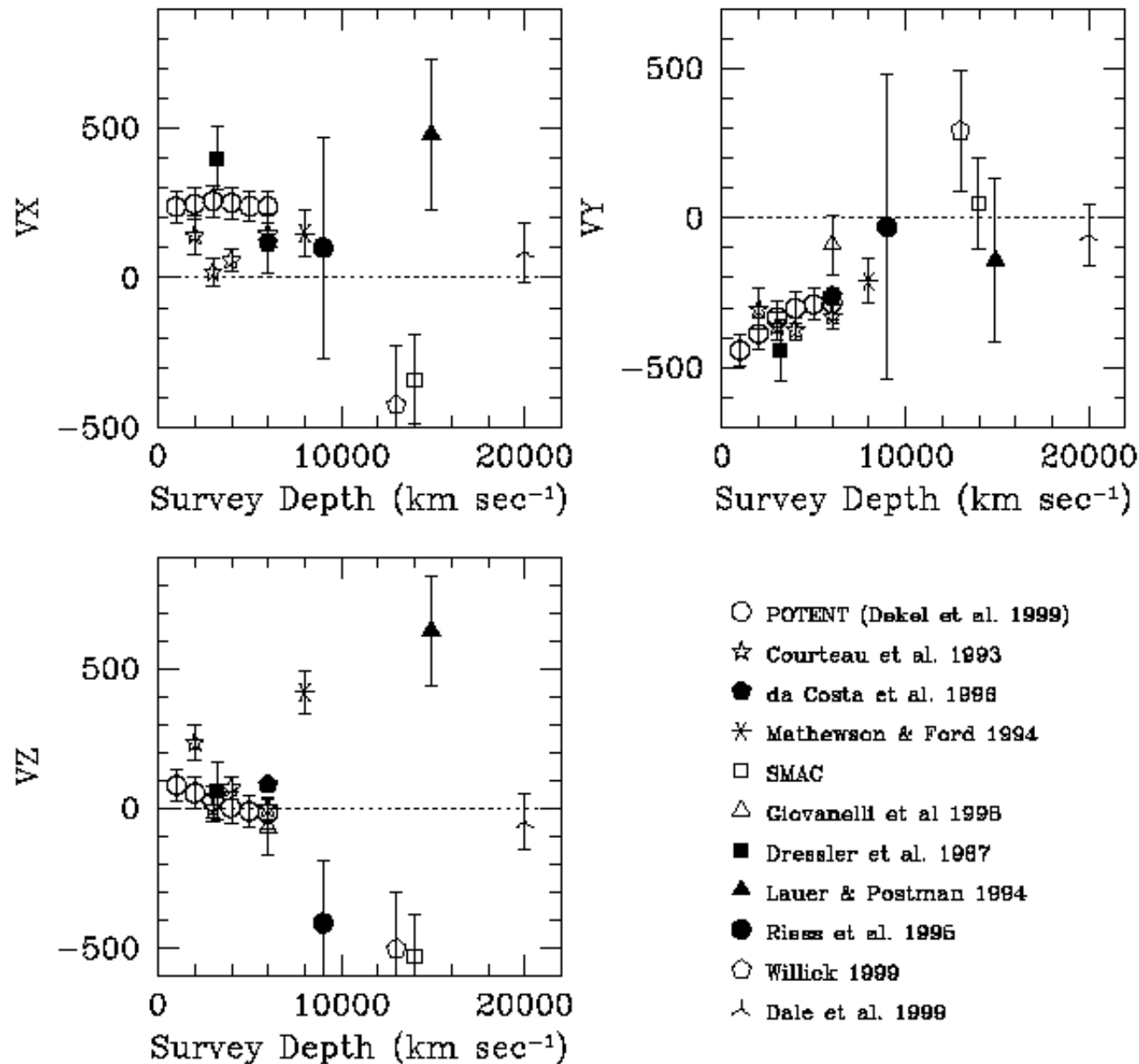
*Errors are often as large as or larger than random errors*

Hudson, 2003





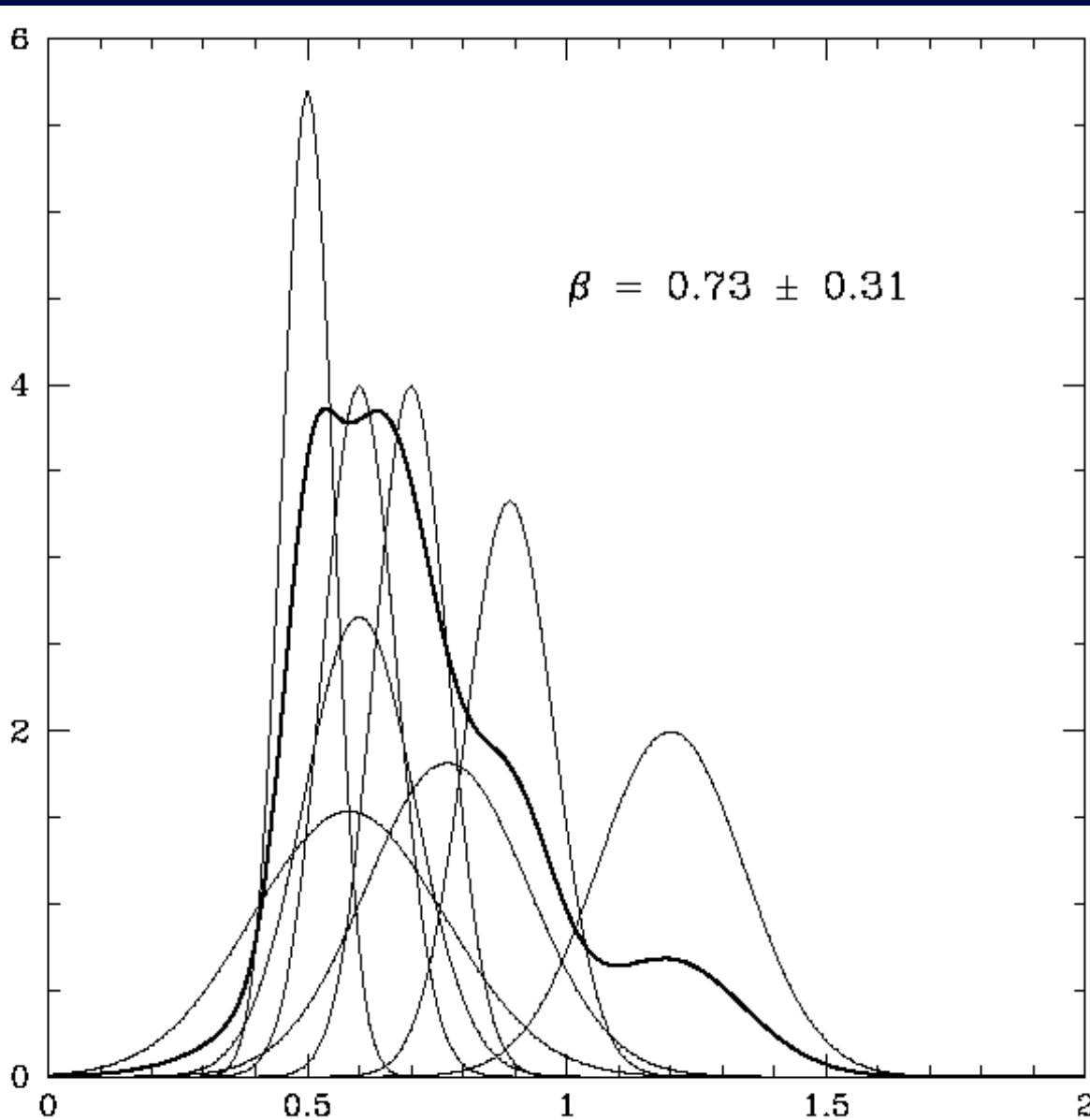
# Bulk Flow Measurements



Strauss, 2000



$$\beta \equiv \Omega^{0.6} / b$$



Systematic effects

Nonlinear effects

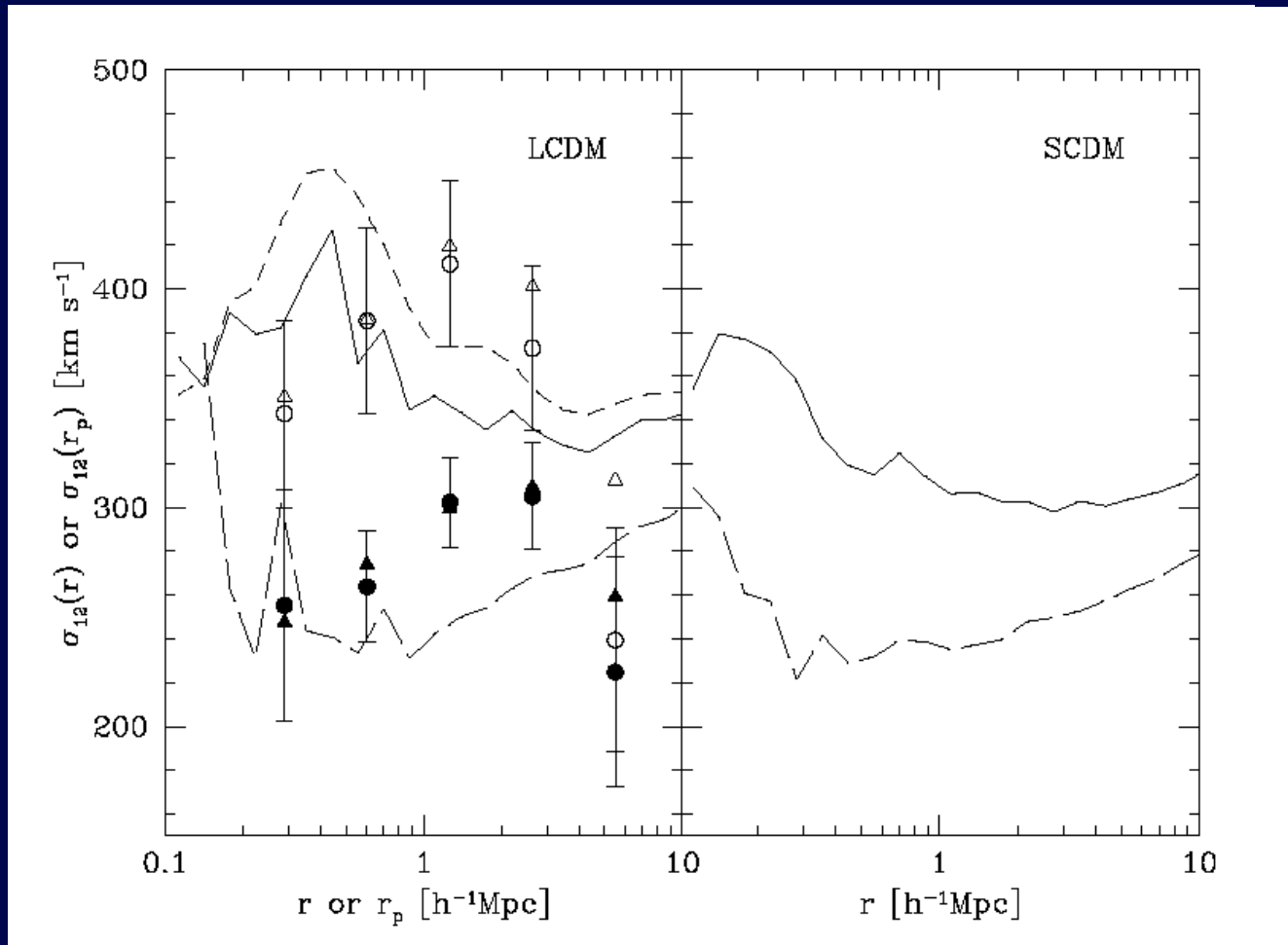
Correlated Errors

Non-trivial biasing

Malmquist biases  
standard candles  
calibration...



## Pairwise velocity Dispersion $\sigma_{12}$



Zhao, Jing & Borner, 2002



# ??? What is going on ???

In large scale observations we look for

**Estimators**

We try to **estimate** an underlying quantity

Estimator = True quantity  $\otimes$  Window function

e.g.

$$\tilde{p} = N \int \frac{d^3 k}{(2\pi)^3} p(\vec{k}) W(\vec{k})$$



$$\tilde{p} = N \int \frac{d^3 k}{(2\pi)^3} p(\vec{k}) W(\vec{k})$$

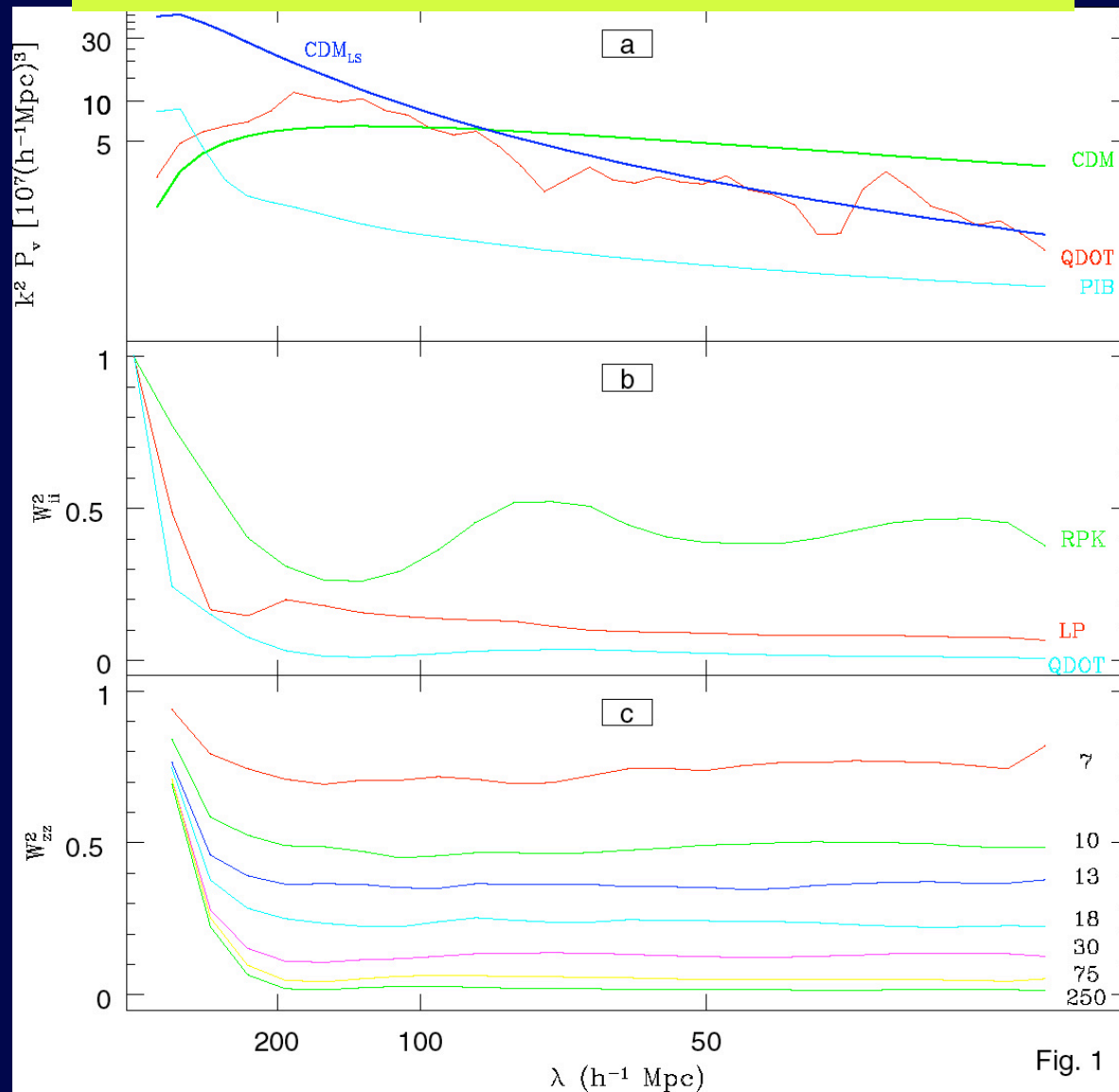


Fig. 1



# Coffee Break



**Are there any statistics that are consistent across surveys**

**Mean Pairwise Velocity ( $v_{12}$ )**

**“The tendency of galaxies to approach each other”**

**Close galaxies (e.g. within a cluster,  $r_{12} < 3$  Mpc):**

**Motion about the local center of mass,  $v_{12} = 0$**

**Far Galaxies ( $r_{12} > 30$  Mpc)**

**No attraction  $\Rightarrow$  no correlations,  $v_{12} \rightarrow 0$**

**For galaxies in intermediate scales**

**$v_{12} < 0$**

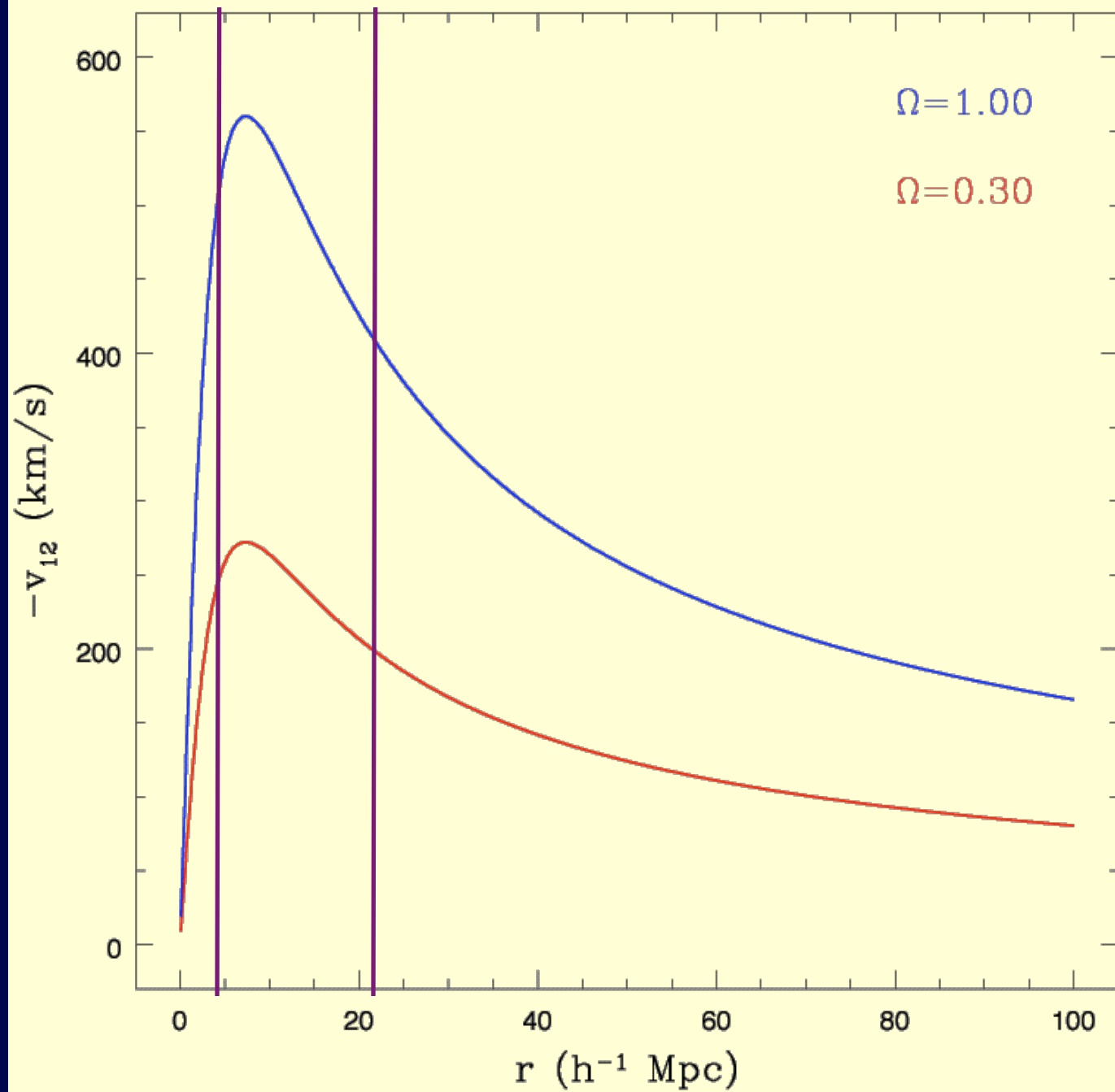
HAF et al 2003 ApJL. 596 131L

Juszkiewicz et al 2000 Science, 287

Ferreira et al 1999, ApJL 515 L1







Can we exploit the mean tendency of well-separated galaxies to approach each other to measure cosmological parameters ?

Consider the dynamical evolution of a collection of particles interacting through gravity.

In the fluid limit the pair-density weighted relative velocity is:

$$\vec{v}_{12}(r) = \langle \vec{v}_1 - \vec{v}_2 \rangle_\rho = \frac{\langle (\vec{v}_1 - \vec{v}_2)(1 + \delta_1)(1 + \delta_2) \rangle}{1 + \xi(r)}$$

$\vec{v}_i$  and  $\delta_i = \rho_i / \langle \rho \rangle - 1$  are the peculiar velocities and the density contrast at a point  $\vec{r}_i$  :  $r = |\vec{r}_1 - \vec{r}_2|$

and  $\xi(r) = \langle \delta_1 \delta_2 \rangle$

Different than the simple weighted average by  $\rho_1 \rho_2 / \langle \rho_1 \rho_2 \rangle$



The magnitude  $v_{12}(r)$  is related to the two-point correlation function  $\xi(r)$  through the pair conservation equation in gravitational instability theory.

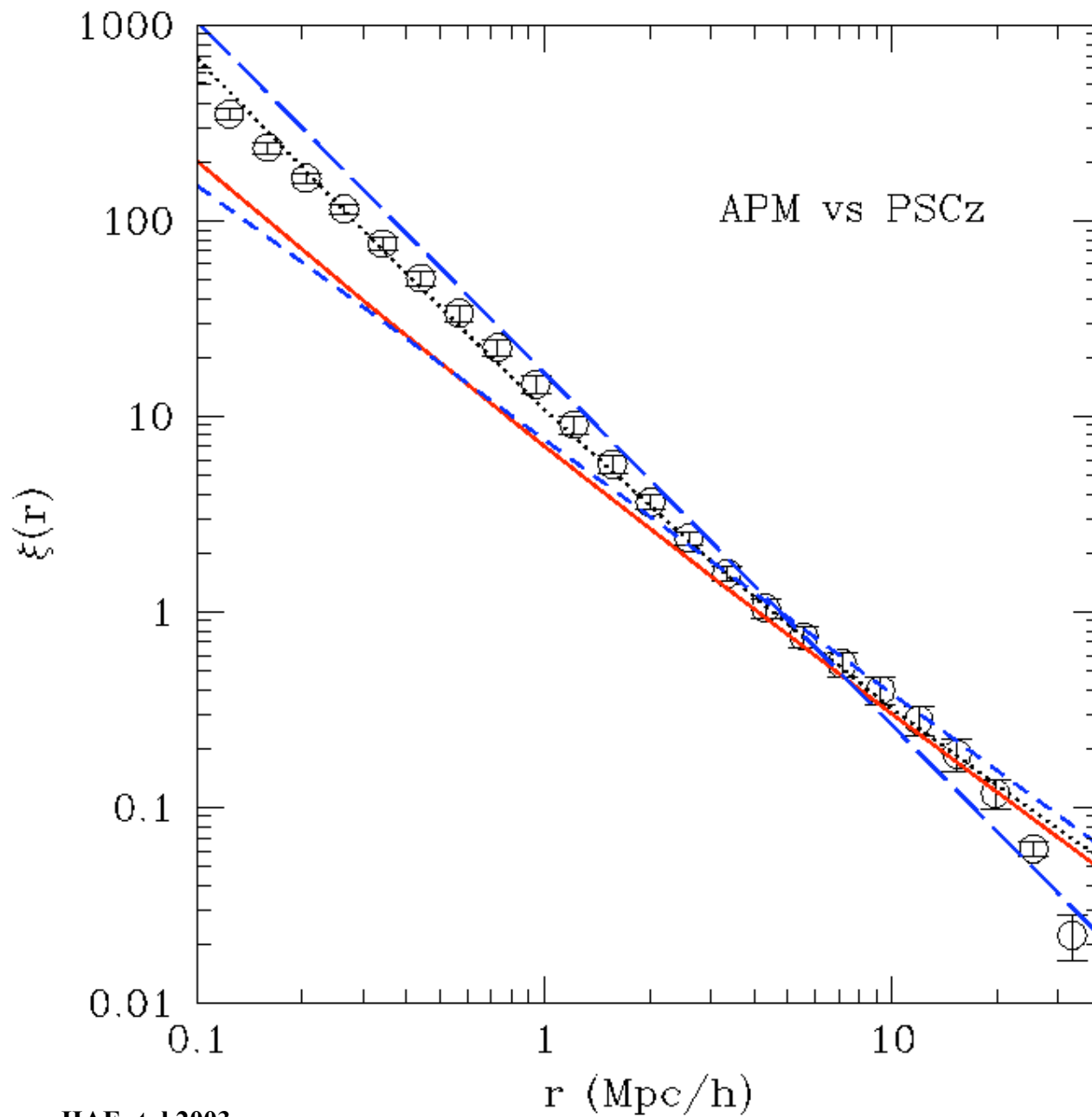
For models with Gaussian initial conditions the solution of the pair conservation equation is well approximated by:

$$v_{12}(r) = -\frac{2}{3} H r \Omega^{0.6} \bar{\bar{\xi}}(r) \left[ 1 + \alpha \bar{\bar{\xi}}(r) \right],$$
$$\bar{\bar{\xi}}(r) = \frac{3}{r^3} \int_0^r \xi(x) x^2 dx \equiv \bar{\xi}(r) [1 + \xi(r)]$$

(Juszkiewicz, Springel & Durrer, 1998)

$\alpha$  is a parameter that depends on the logarithmic slope of  $\xi(r)$





HAF et al 2003



We cannot estimate  $v_{12}$  directly since we only observe the line-of-sight component of the peculiar velocity:

$$s_A = \frac{\vec{r}_A \cdot \vec{v}_A}{r} \equiv \hat{r}_A \cdot \vec{v}_A$$

Instead use the mean difference between the radial velocities of a pair of galaxies:

$$\langle s_1 - s_2 \rangle_p = v_{12} \hat{r} \cdot (\hat{r}_1 - \hat{r}_2) / 2 \quad \text{where} \quad \vec{r} = \vec{r}_1 - \vec{r}_2$$

To estimate  $v_{12}$  we minimize the quantity

$$\chi^2(r) = \sum_{A,B} \left[ (s_A - s_B) - p_{AB} \tilde{v}_{12}(r) / 2 \right]^2$$
$$p_{AB} \equiv \hat{r} \cdot (\hat{r}_A + \hat{r}_B)$$

The sum is over all pairs with some fixed separation  $r$ .



Mark III: 2437 spirals and 544 ellipticals

SFI: 1300 late type spirals

ENEAR: 1359 Ellipticals

RFGC: 1327 Spirals

The estimates from the each of the catalogs are similar,

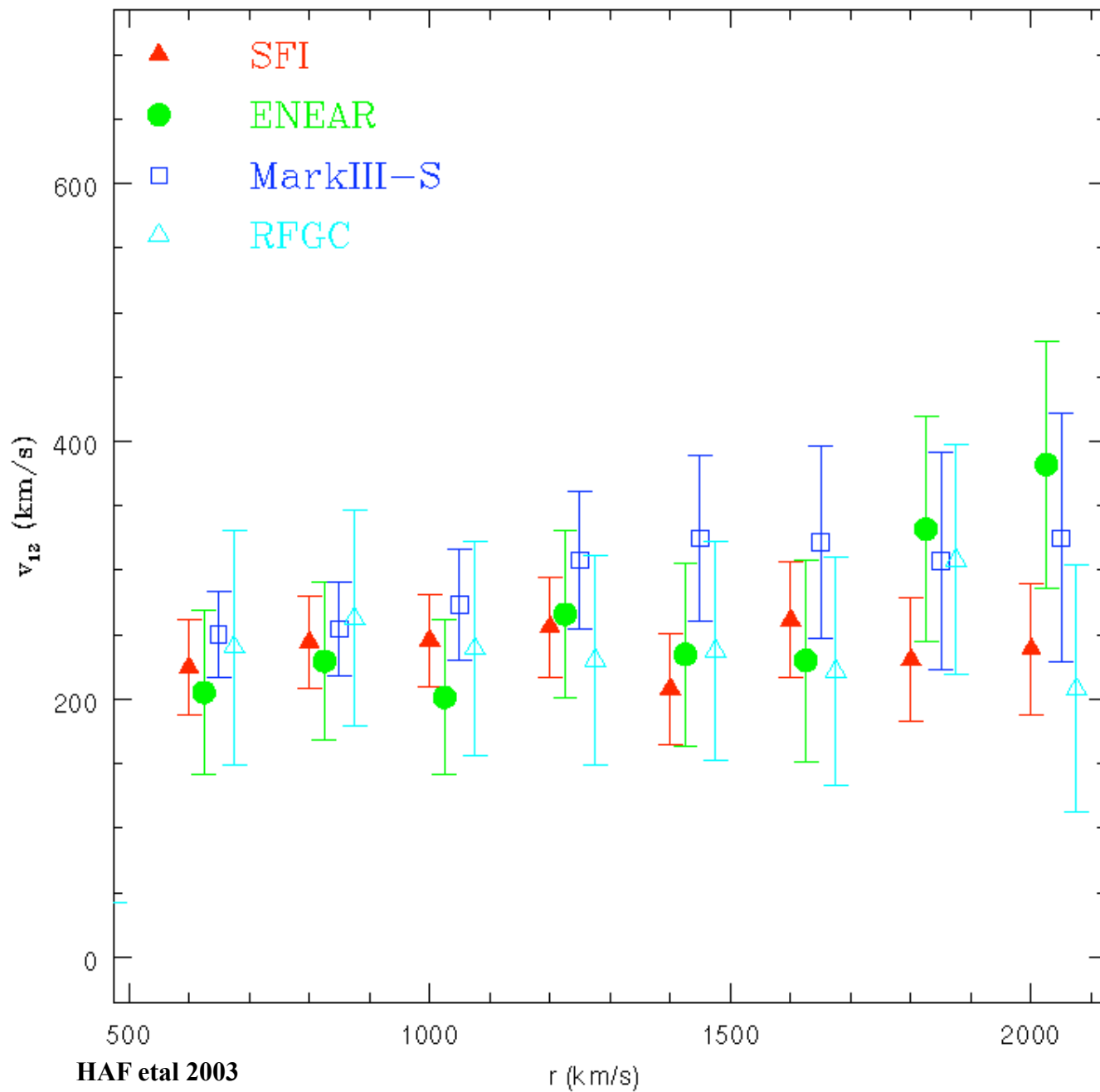
⇒ NO velocity bias

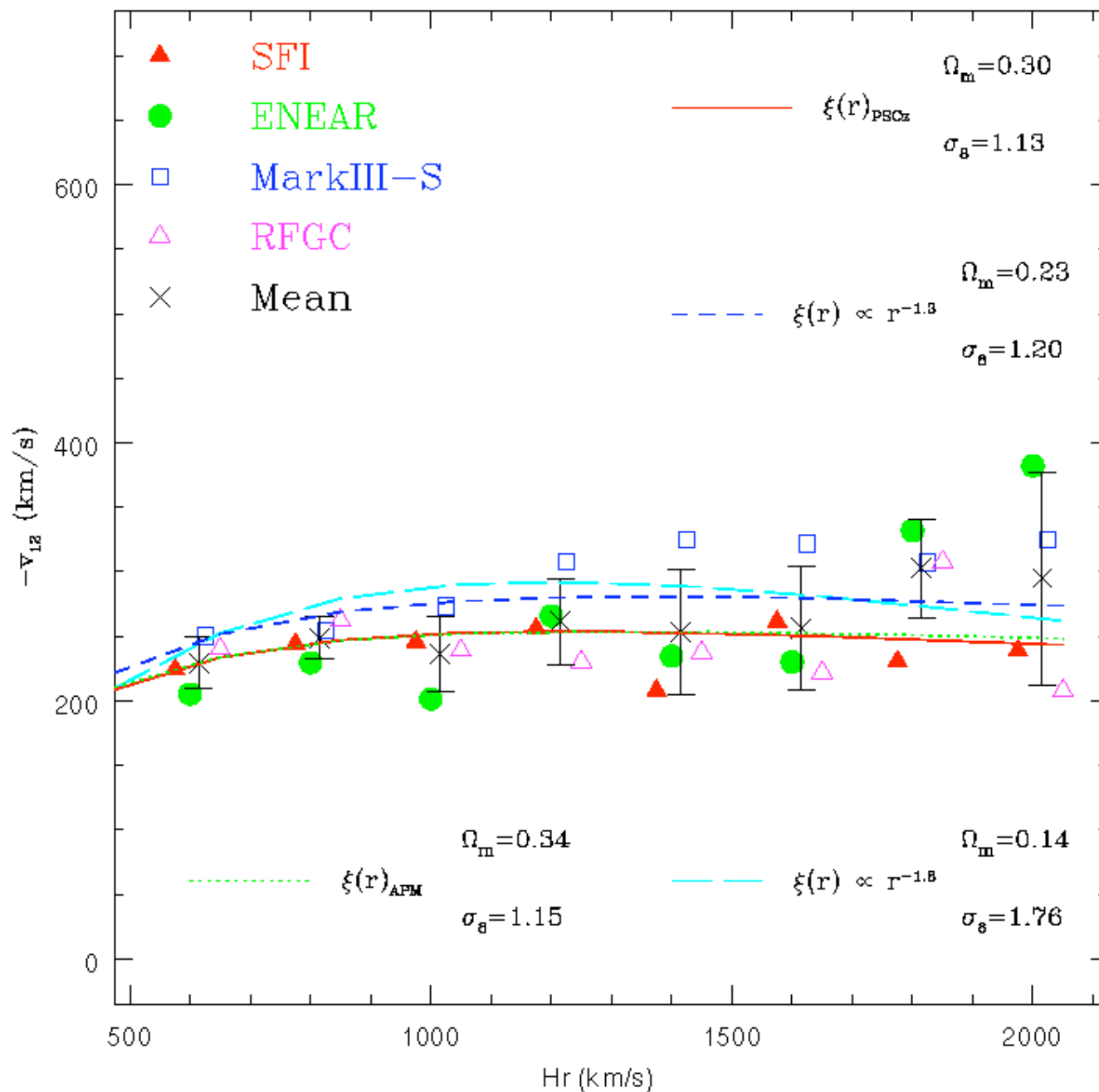
Standard linear bias model assumes:  $\delta_g = b \delta$

The ratio of  $v_{12}$  from the elliptical and spiral samples is:

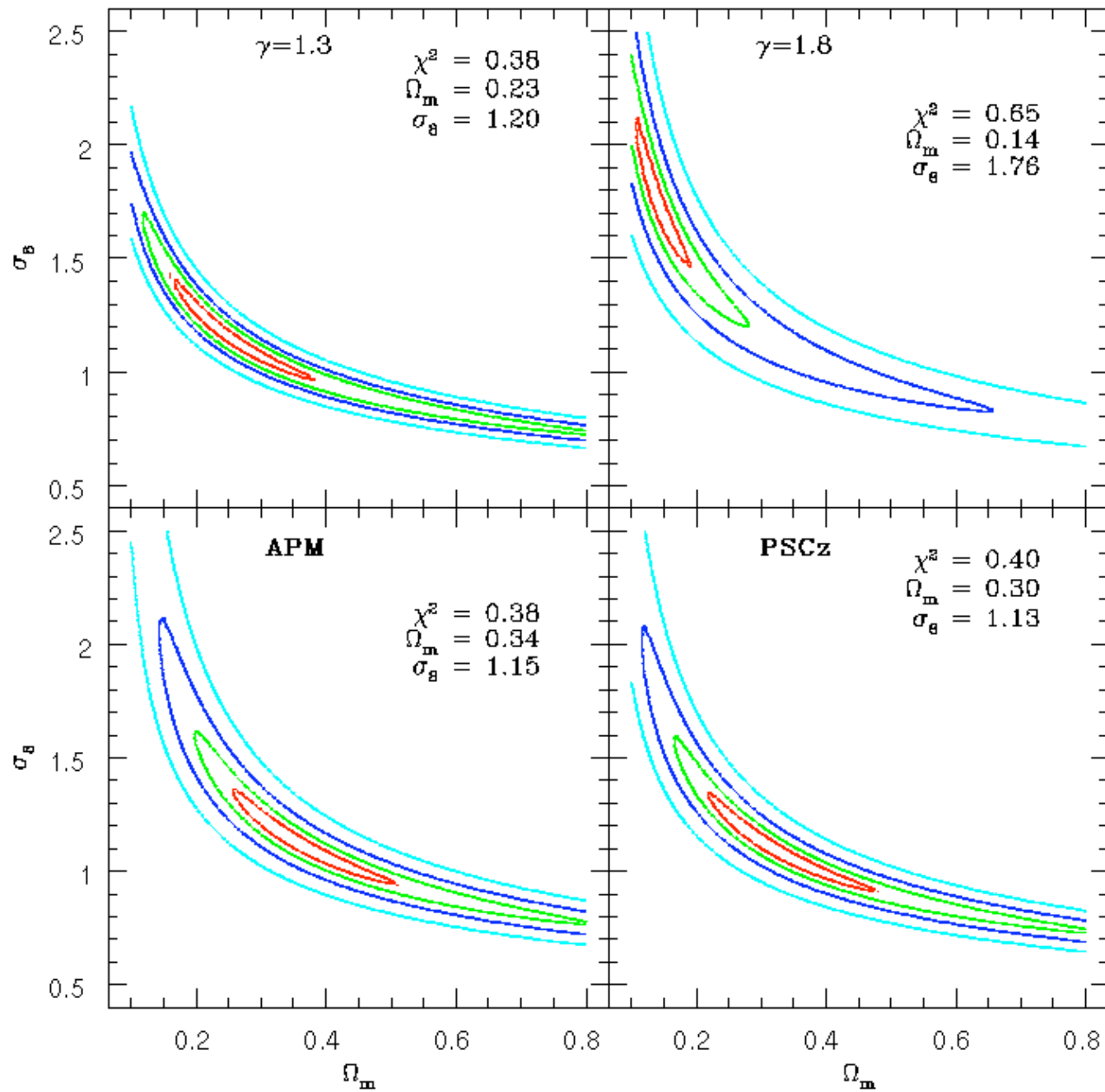
$$\frac{v_{12}^{(E)}}{v_{12}^{(S)}} = \frac{b_E}{b_S} = 1 \pm 0.15$$











The VELMOD (Willick et al 1997) analysis constrains

$$\beta = \Omega^{0.6} \sigma_8 \quad \text{to be} \quad \beta = 0.5 \pm 0.05$$

From velocity – density using the Mark III and IRAS 1.2 Jy.

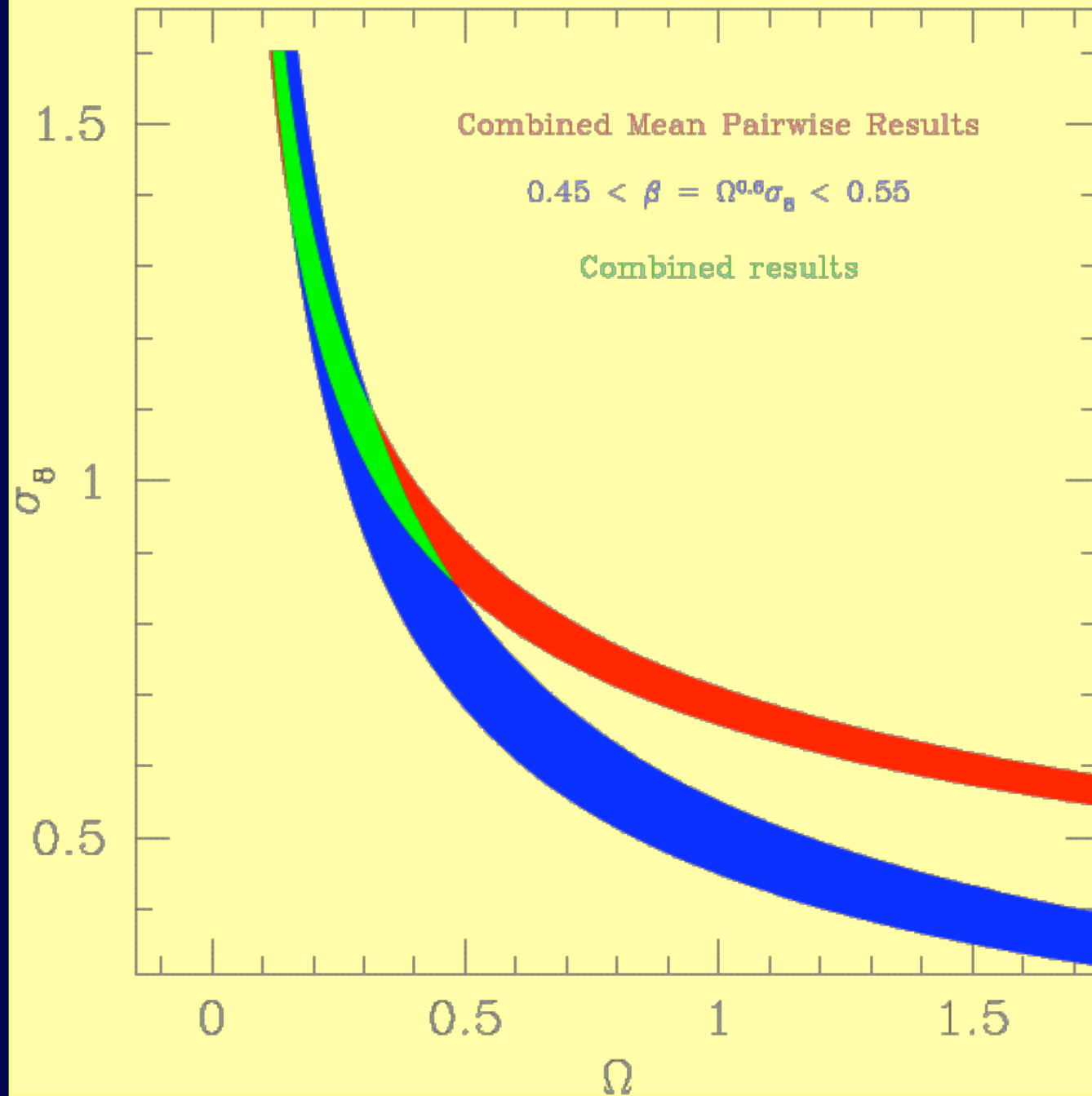
Since the  $(\Omega, \sigma_8)$  dependence of  $v_{12}$  and  $\beta$  are different we may use both to break the degeneracy between  $\Omega$  and  $\sigma_8$ .

Results: Low density Universe

$$\Omega < 0.5$$

$$\sigma_8 > 0.9$$





# Optimal Moments for the Analysis of Peculiar Velocity Surveys

Hume A. Feldman

The University of Kansas

With

Rick Watkins

ApJ 564 534–541 2002

ApJ 599, 820–828 2003.

**Removal of non linear effects,  
aliasing and incomplete  
cancellations**



## Likelihood Methods for Peculiar Velocities

The analysis of observed line-of-sight velocities:

$N$  objects with positions  $\mathbf{r}_i$  and line-of-sight velocities  $v_i$ .

The observed velocity:  $v_i = \underbrace{\vec{v}(\vec{r}_i) \cdot \hat{r}_i}_{\text{Linear velocity field}} + \delta_i \leftarrow \text{noise}$

The covariance matrix:

$$R_{ij} = \langle v_i v_j \rangle = R_{ij}^{(v)} + \delta_{ij} (\sigma_i^2 + \sigma_*^2)$$



$$\begin{aligned} R_{ij}^{(v)} &= \frac{1}{(2\pi)^3} \int P_{(v)}(k) W_{ij}^2(k) d^3k \\ &= \frac{H^2 f^2(\Omega_0)}{2\pi^2} \int P(k) W_{ij}^2(k) dk \end{aligned}$$



The probability distribution for the line-of-sight peculiar velocities:

$$L(v_1, \dots, v_N; P(k)) = \sqrt{|R^{-1}|} \exp\left(\frac{-v_i R_{ij}^{-1} v_j}{2}\right)$$

Alternately, given a set of velocities  $(v_1, \dots, v_n)$

$\Rightarrow L(v_1, \dots, v_N; P(k))$  is the likelihood functional for the power spectrum.

Given a power spectrum parameterized by some vector

$$\Theta = (\theta_1, \dots, \theta_s)$$

$\Rightarrow L(v_1, \dots, v_N; \Theta)$  is the likelihood functional for the parameter  $\Theta$ .

The value of the parameter vector that maximizes the likelihood is  $\Theta_{ML}$



Define the Fisher Transformation matrix:

$$F_{ij} = \left\langle \frac{\partial^2 (-\ln L)}{\partial \theta_i \partial \theta_j} \right\rangle \bigg|_{\Theta = \Theta_0}$$

The variances for an unbiased estimators are:

$$\Delta(\theta_{ML})_i \geq (F_{ii})^{-1/2}$$

Cramér-Rao  
inequality

In the limit of large **N** this becomes an equality

Here we assume that this limit is satisfied.



# Data Compression

Karhunen-Loève methods:

Kendall & Stuart (1969)

Tegmark, Taylor & Havens (1997)

Watkins et al 2002

HAF et al 2003

Replace  $N$  original line-of-sight velocities  $v_1, \dots, v_N$   
with  $M$  moments  $u_1, \dots, u_M$  where  $M \leq N$ .

Here we concentrate on linear data compression where the  
moments are:

$$u_i = B_{ij} v_j$$

$B_{ij}$  is an  $M \times N$  matrix .

If  $M < N \Rightarrow$  we lose information.

We arrange it such that the lost information is primarily  
associated with small scales.





Suppose we compress all the velocity information into a single moment.

$$u = b_i v_i.$$

Where  $b_i$  is a  $1 \times N$  set of coefficients.

The Fisher matrix for the compressed data is:

$$\tilde{F}_{qq} = \frac{1}{2} \left| b_i \frac{\partial R_{ij}}{\partial \theta_q} b_j \right|^2$$

Where  $b_i R_{ij} b_j = 1$

Since  $\Delta \theta_q^2 = 1 / F_{qq}$  we can find a moment that carries the minimum information about  $\theta_q$  by minimizing the RHS.



Introduce a Lagrange multiplier and extremize  
with respect to  $b_i$

$$\left| b_i \frac{\partial R_{ij}}{\partial \theta_q} b_j \right| - \lambda b_i R_{ij} b_j$$

Since  $R_{ij}$  is symmetric and positive definite we can  
Cholesky decompose it:

$$R_{ij} = L_{ik} L_{jk}$$

For some invertible Matrix  $L_{ij}$ .



Eigenvalue problem:

$$\left( L_{ki}^{-1} \frac{\partial R_{ij}}{\partial \theta_q} L_{lj}^{-1} \right) (L_{ml} b_m) = \lambda (L_{jk} b_j)$$



Solving this gives us a set of  $N$  orthogonal eigenvectors  $L_{ji}(b_n)_j$  with corresponding eigenvalues  $\lambda_n$ .

Eigenvector  $L_{ji}(b_n)_j \iff u_n = (b_n)_i v_i$  Moment

The moments  $u_n$  are statistically independent, of unit variance:

$\Rightarrow$  Finding  $\lambda_n$  gives us the error bar of  $\theta_q$

$\Rightarrow$  If we convert the velocities into  $N$  moments there will be no loss of information and the transformation matrix will be invertible.

Since the moments are statistically independent, when we compress the data by removing selected moments, the information contained by those moments will be completely removed from the data.



## Moment Selection

Order the moments in order of increasing eigenvalues:

$$\lambda_1 \leq \lambda_2 \leq \dots \leq \lambda_N$$

Each moment carries successively more information about  $\theta_q$  with  $u_n$  carries the maximum possible amount of information.

### Goal:

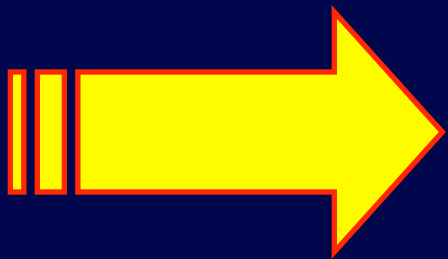
Produce a data set that is less sensitive to the value of  $\theta_q$  and keep as many moments as possible to retain the information about large scales.



## Criterion:

- 1) Estimate  $\theta_q = \theta_{q0}$
- 2) Keep the largest number  $M$  such that  $\Delta\theta_q \geq \theta_{q0}$

If our estimate of  $\theta_q$  is correct



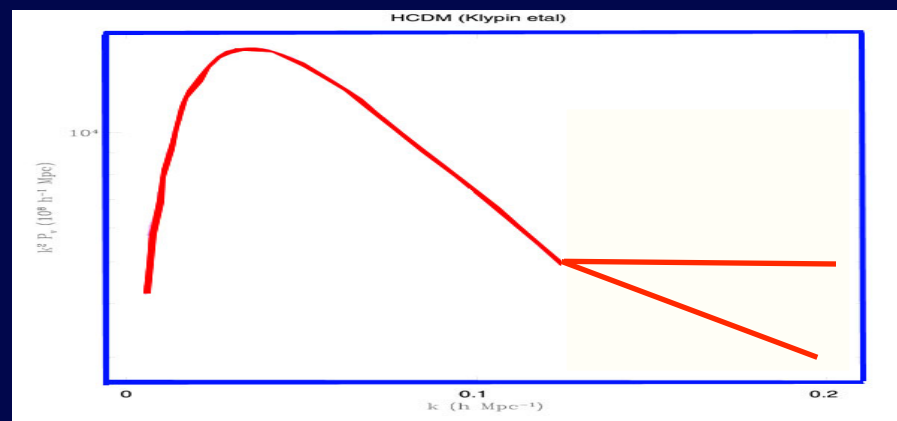
The set of moments  $u_1, \dots, u_M$  will not contain enough information to distinguish  $\theta_q$  from zero.



# Power Spectrum Model

Assume that:

$$P(k) = P_l(k) + \theta_q P_{nl}(k)$$



Where  $P_l(k) = 0$  for  $k > k_{nl}$  Use the BBKS power spectrum for  $P_l(k)$ .

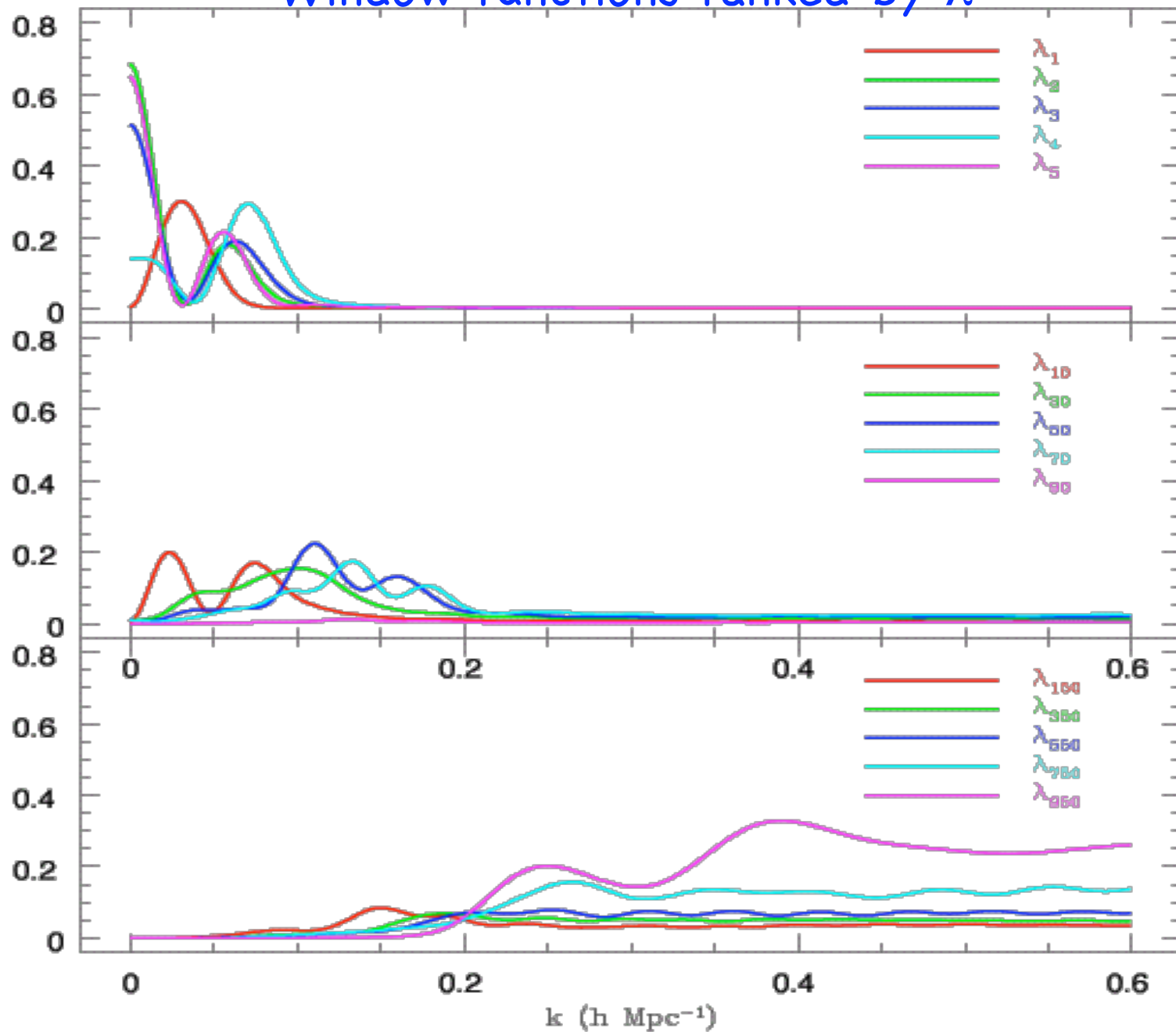
$P_{nl}(k) = 0$  for  $k < k_{nl}$  Try e.g.  $P_{nl}(k) \propto k^{-1}$

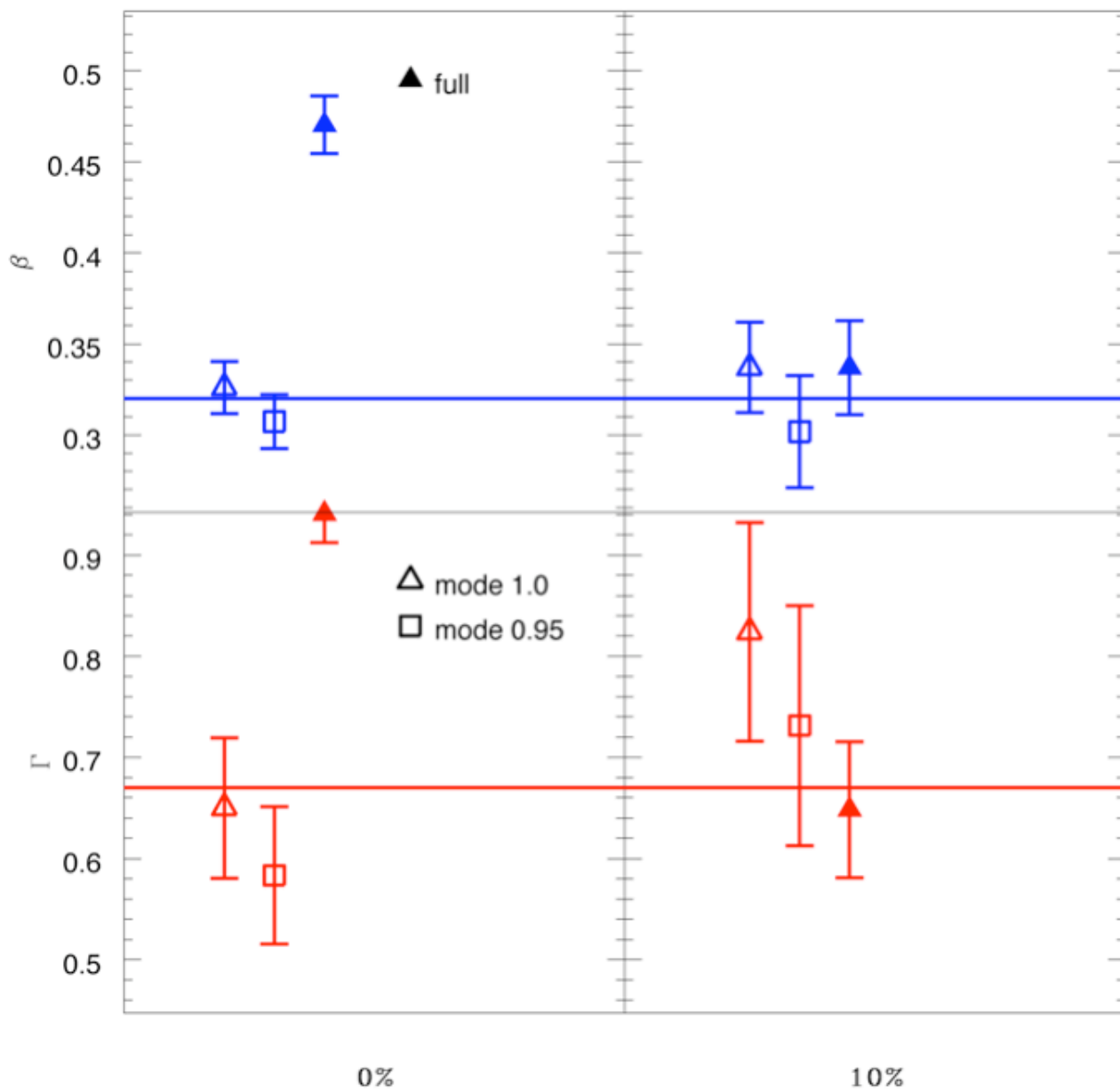
We choose  $P_{nl}(k) = P_0$  for  $k_{nl} < k < k_c$ .

Where contribution of nonlinear scales to line-of-sight velocity dispersion ( $\sigma^*$ ) should equal the estimate from the data.

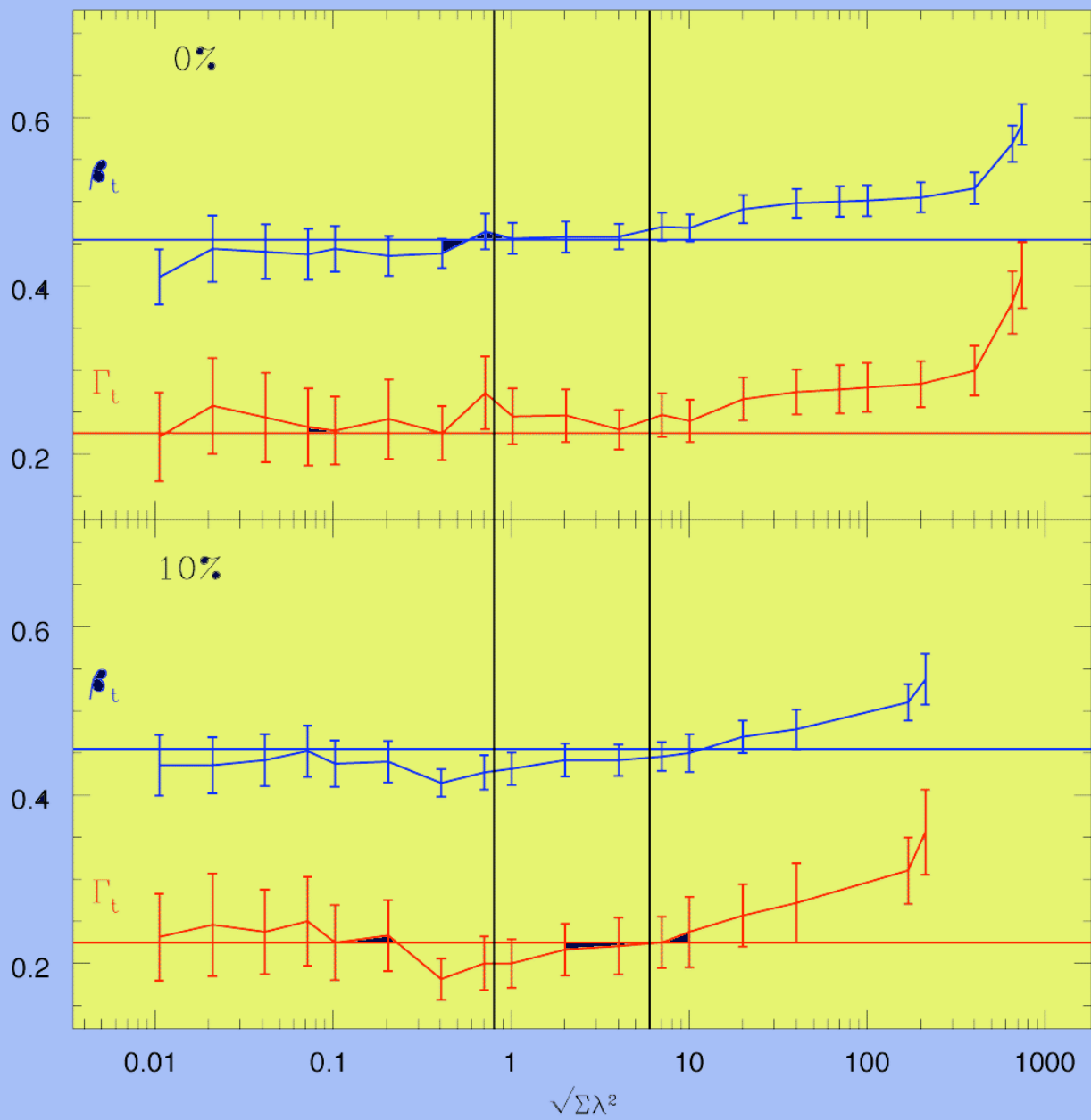


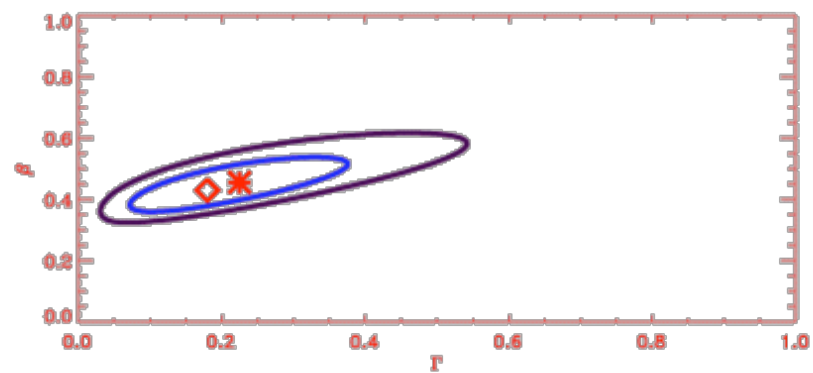
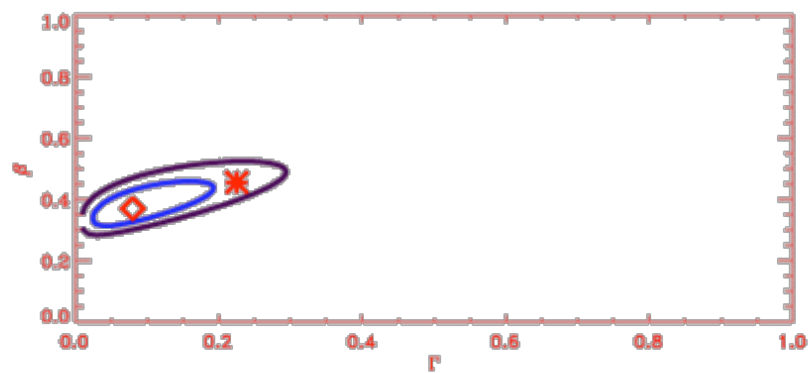
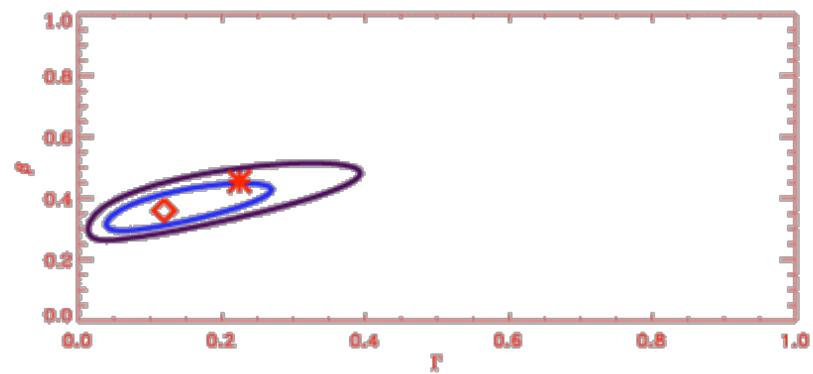
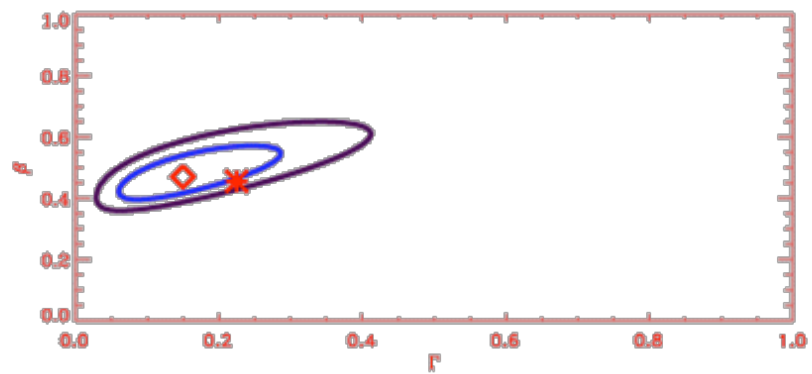
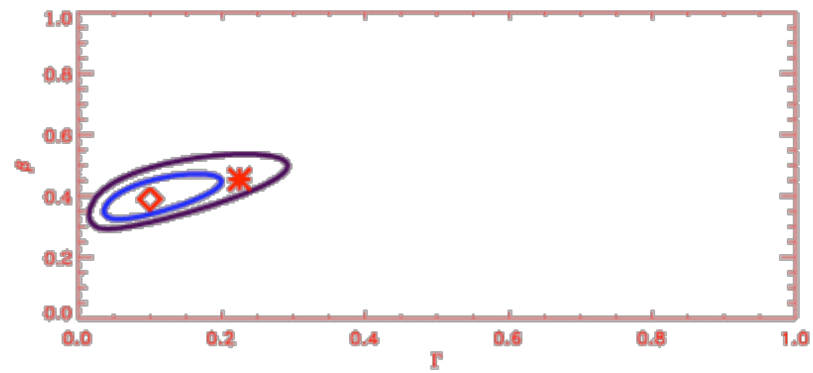
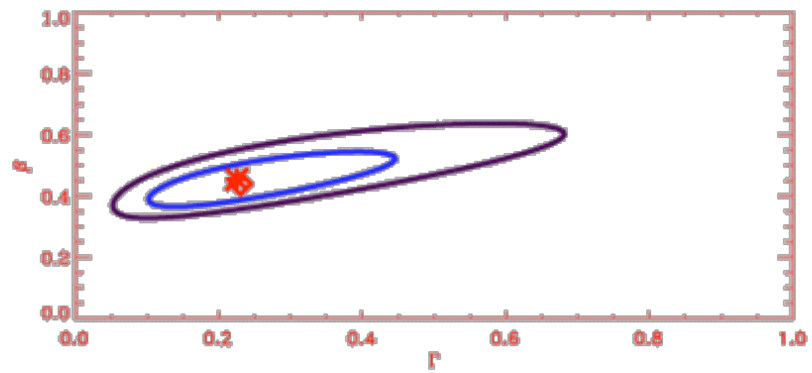
# Window functions ranked by $\lambda$

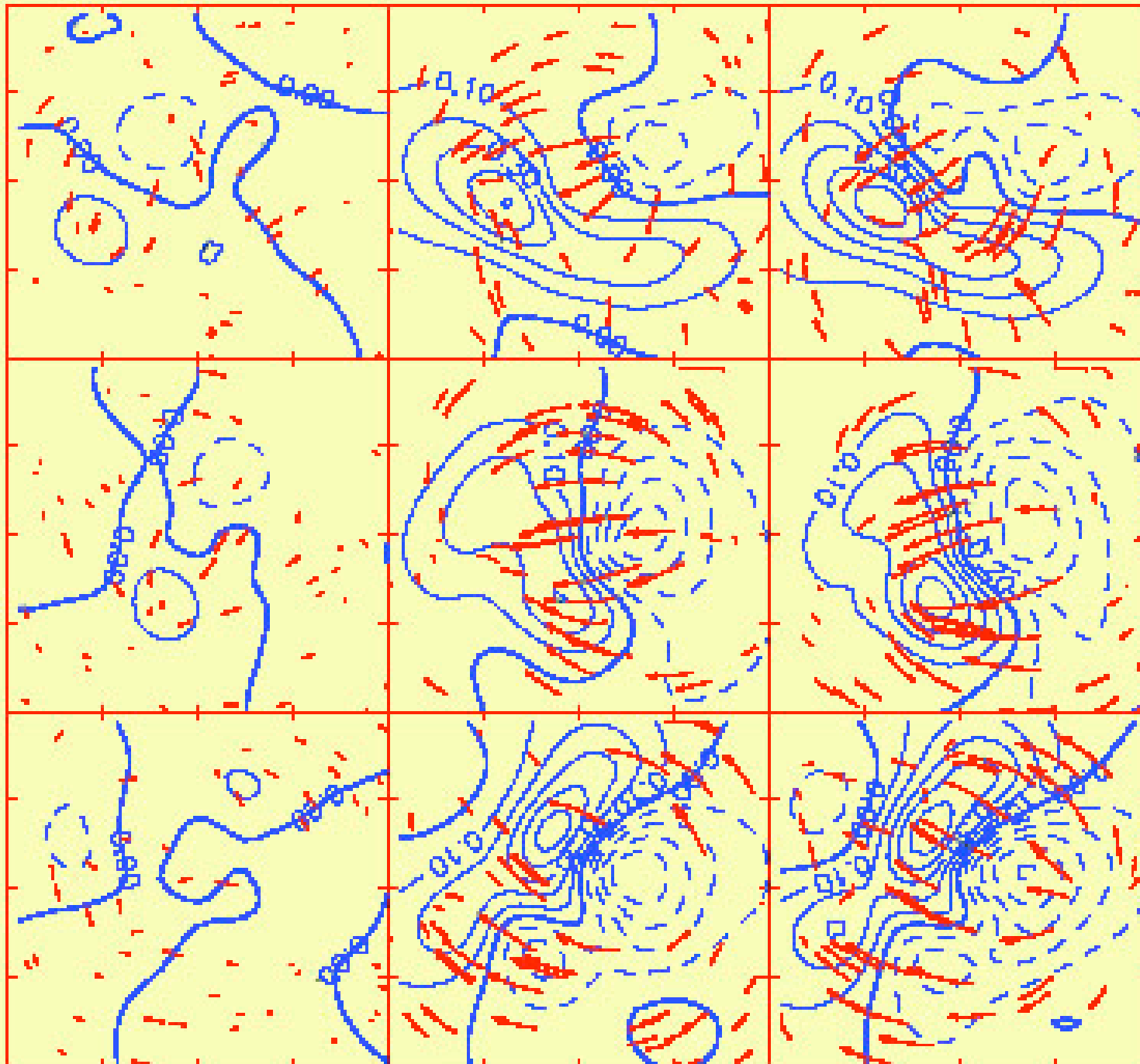












**xy-plane**

HAF, Hoffman  
& Nusser

**xz-plane**

**yz-plane**



High  
density  
Regions



Low  
density  
Regions



# Cosmological Constant with velocity Fields

$$\left(\frac{H}{H_o}\right)^2 = \Omega_o(1+z)^3 - \left(\Omega_o + \Lambda_o - 1\right)(1+z)^2 + \Lambda_o$$

$$\Omega(\Omega_o, \Lambda_o, z) = \Omega_o \left(\frac{H}{H_o}\right)^{-2} (1+z)^3$$

$$f(\Omega_o, \Lambda_o, z) = X^{-1} \left( \Lambda_o(1+z)^{-2} - \frac{1}{2}\Omega_o(1+z) \right) - 1 \\ + (1+z)^{-1} X^{-3/2} \left( \int_0^{1+z)^{-1}} X^{-3/2} da \right)^{-1}$$

Where

$$X = 1 + \Omega_o z + \Lambda_o (1+z)^{-2} - 1$$



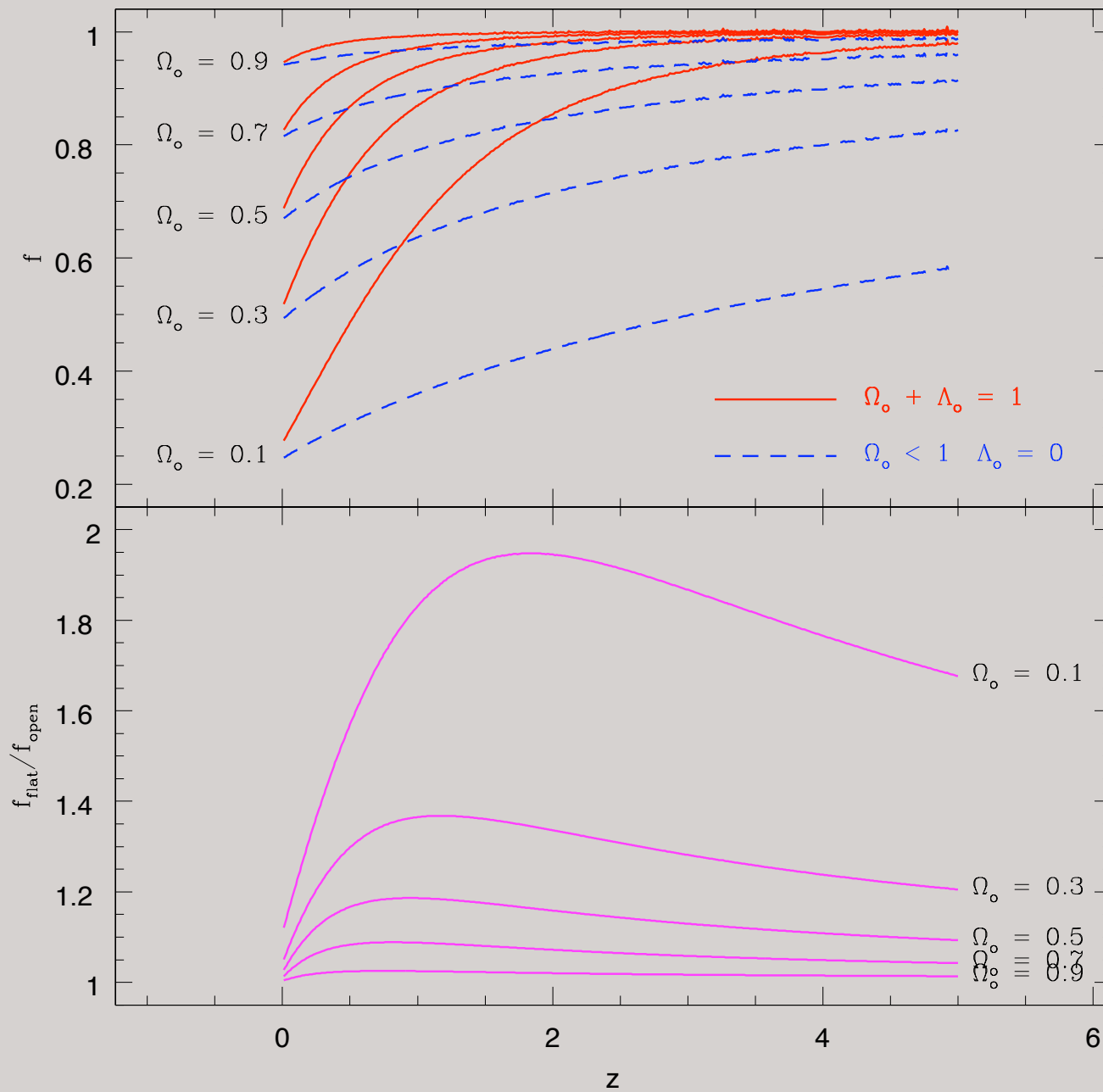
$$\frac{H_{flat}}{H_{open}} = \left( \frac{1 + \frac{(\Omega_o^{-1} - 1)}{1+z}}{1 + \frac{(\Omega_o^{-1} - 1)}{(1+z)^3}} \right)^{-0.5}$$

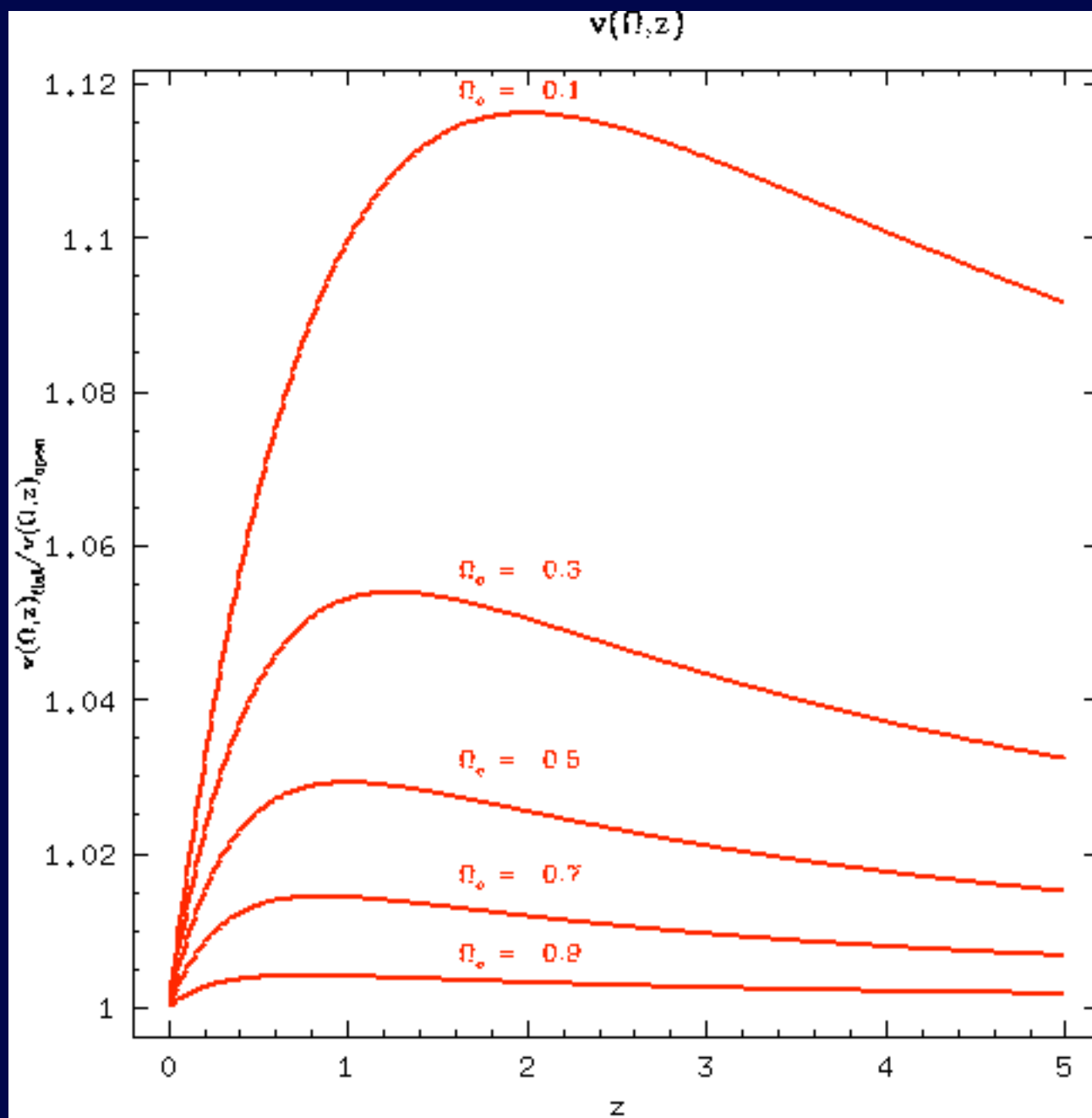
$$\frac{f_{flat}}{f_{open}} = \left( \frac{1 + \frac{(\Omega_o^{-1} - 1)}{1+z}}{1 + \frac{(\Omega_o^{-1} - 1)}{(1+z)^3}} \right)^{0.6}$$

$$\frac{v_{flat}}{v_{open}} = \left( \frac{1 + \frac{(\Omega_o^{-1} - 1)}{1+z}}{1 + \frac{(\Omega_o^{-1} - 1)}{(1+z)^3}} \right)^{0.1}$$



$$f(\Omega_o, \Lambda_o, z)$$







## Concluding remarks

- Distance measurements are good.
- Determination of  $H_0$ ,  $\Omega$ ,  $\Lambda$ ,  $\sigma_8$ ,  $b$ , ...
- Mapping of the Large-scale peculiar velocity field
- Study of the gravitational potential
- A 'true' tracer of the mass distribution
- We have some robust and consistent statistics
- We need:
  - Deeper and denser surveys
  - More accurate distance measurements

Velocity Fields Forever 



